

The Influence of Ownership Structure on ESG Ratings

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Abstract	
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The increasing trend towards sustainability within the investment community has motivated this paper to investigate the relationship between ownership structure and ESG rating score. Using data from 735 companies between 2009 and 2018, this paper applies a fixed effects regression to evaluate the influence of ownership type and ownership concentration on the ESG score. The results indicate that the various classes of investors holding shares in a company do have an influence on the level of the ESG score. In particular, it has been found that state ownership does affect the ESG score in a positive way, whereas ownership of institutional investors, corporations and individuals exhibits a negative influence on ESG. Moreover, our analysis suggests that with increasing ownership concentration the ESG score experiences a larger negative impact.

Keywords: ESG, CSR, Ownership, Sustainability, Concentration

Acknowledgements: We would like to thank Professor Michael Halling for inspiration, encouragement and his valuable guidance throughout the process of writing this thesis.

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1. Introduction

"Sustainable investing will be a core component for how everyone invests in the future. We are only at the early stages."

- Larry Fink, BlackRock Inc. chairman and chief executive (Financial Times, 2018)

With climate change, environmental disasters, and social instabilities, the world is facing major challenges today. The leading opinion in the international community is that actions must be taken to prevent more devastating consequences to the extent possible. Major initiatives aiming to combat these developments are drawing the attention of the world's population. One of the most popular initiatives are the *Sustainable Development Goals* of the United Nations, published in 2015. These are intended to ensure that economic growth is reconciled with environmental protection and social needs (United Nations, 2019). The positive trend can also be observed in the business environment, where the number of companies promoting corporate social responsibility (CSR) has increased considerably (European Commission, 2001). According to the latest UN Global Compact study, 75% of the respondents declared that they incorporate the *Sustainable Development Goals* into their decision making (United Nations Global Compact, 2017).

Nevertheless, concerning financial liquidity, these international companies are highly dependent on the global capital market. Investors exert pressure on companies to report their commitment on sustainability issues (United Nations Global Compact, 2014) and require meaningful sources to evaluate this commitment. The ESG score represents such a source of information. It provides a comprehensive source for a company's environmental, social, and governance (ESG) rating, which includes performance, commitment, and effectiveness. The score can reach values between 0 and 100. A higher ESG score, *ceteris paribus*, is associated with a higher commitment to sustainability issues of a company (Refinity, 2019). In order to help investors evaluating the information, major initiatives have appeared in the marketplace such as the Principles of Responsible Investment (PRI) which were initiated as independent advice for investors on how to address ESG factors (PRI, 2019a). Although these trends exist, it is of great relevance for companies and policy makers to determine whether investors are truly interested in participating in the wave of sustainability.

The purpose of this thesis is therefore to examine the world of investors and their respective approach towards sustainability in more detail. It seeks to determine whether the orientation

towards sustainability is reflected in the preferences and actions of investors. Has the trend indeed already made its way into the financial world, in which profit by definition is the first priority? Or is its prevalence not as popular as the hype mentioned in the beginning seems to indicate? As investor types vary in their characteristics and strategic goals, we aim to investigate whether and in which direction each type exerts influence on a company's ESG engagement, in particular of those companies included in the *S&P 500*. We assess whether ownership structure, which is defined by the type of investors holding shares and the percentage each type holds (from now on called concentration), influences the level of the ESG score. Consequently, the following research question guides the analysis and critical evaluation presented in this paper:

"What influence does the ownership structure have on the ESG score?"

This paper investigates two relationships of interest: (1) the influence of ownership type and (2) the influence of ownership concentration on the level of ESG score. When assessing the first relationship, the focus of the analysis is on six distinct investor classes: state, institutional investors, individuals, banks, corporations, and pension funds. The relationship is explored by applying a *fixed effects model*, which was chosen because it controls for effects which are constant (Wooldridge, 2012) - for example, ones occurring because the company is operating in a specific industry, or ones related to specific years (e.g., due to economic trends). The impact direction of investors in our results is either (i) positive, (ii) negative, or (iii) neutral. Our analysis indicated that indeed most of the investors (institutional investors, corporations and individuals) exhibit a negative influence on ESG (ii), while only one investor class (namely, the state) appears to have a positive impact on ESG (i). Regarding banks and pension funds, we found neutral results (iii).

Secondly, the impact of ownership concentration is investigated. Specifically, we examined the influence of ownership concentration on ESG rating by applying another *fixed effects model* with the *Herfindahl-Hirschman Index (HHI)* as a measure of concentration. The *HHI* is an important indicator for market concentration, which is widely used in academia and practice (Rhoades, 1993). The results suggested that with increasing ownership concentration, the ESG score is negatively influenced. Building on our initial analysis, our empirical results were furthermore tested through a set of robustness checks, which provided evidence for the statistical validity of our findings.

This paper adds a relevant contribution to the existing body of research on ESG. While the financial performance ESG link has been already thoroughly researched (e.g., Eccles et al., 2014; Orlitzky et al., 2003; Surroca et al., 2010), the link between ESG and ownership has not drawn the same attention so far. Most studies focus on one or two particular types of owners only (e.g., Erhemjamtsa & Huang, 2019; Lopatta et al., 2017) or do not focus specifically on ESG but rather on CSR (e.g., Dam & Scholtens, 2012), which is often used synonymously but still includes some differences. Our findings have important economic implications, as they provide proof that although awareness and initiatives have increased, the sustainability focus is not yet at the top of priority of most investors today. Rather, we found that most of the investor classes exhibit a negative influence on ESG.

The remainder of this paper is organized as follows: first, in chapter 2 relevant previous literature and research are aggregated and summarized to provide a thorough theoretical background for the subsequent empirical analysis. Chapter 3 builds upon these findings and explains our research question and hypotheses. In chapter 4 the methodology and data collection applied to answer this research question are presented. Chapter 5 then discusses and evaluates our empirical findings. Chapter 6 outlines the robustness checks applied to these results to test the validity, while chapter 7 introduces some potential limitations of this study. The paper closes in chapter 8 by offering a final conclusion.

2. Background

This chapter provides the theoretical background for the hypotheses derived in chapter 3. First the developments towards sustainability are analyzed, both in general and more specifically in the financial market. Afterwards, an overview of the different types of investors is provided as well as their specific characteristics are discussed.

2.1 Trend towards Sustainability

A few decades ago, a new trend started off, and scientists began to investigate the scope of corporate responsibility beyond the mere desire for profit maximization. One of the first publications regarding this topic was *Social Responsibilities of the Businessman* by Howard R. Bowen in 1953, which addressed the obligation to incorporate business ethics and social responsibility in the decision-making process. Since then, there has been a substantial development in the area of social responsibility, with one of the biggest initiatives being the 17 *Sustainable Development Goals* of the Sustainable Development Agenda 2030 initiated by the United Nations in 2015. Signed by the world leaders, these goals are intended to ensure a sustainable development at the economic, ecological, and social levels (United Nations, 2019). Furthermore, with the UN Global Compact, a worldwide contract was developed between the UN and over 13,000 companies becoming the world's largest corporate sustainability initiative to date (United Nations Global Compact, 2014). It lays out 10 principles for a sustainable and inclusive world economy for the benefit of people, communities, and markets, both today and in the future (Global Compact, 2019a). The principles are grouped into four areas: human rights, labor, environment, and anti-corruption (Global Compact, 2019b).

Within business, the awareness of social responsibility has become more prominent. Today, 93% of CEOs consider sustainability to be important for their future success (United Nations Global Compact, 2014). Nevertheless, the view on corporate social responsibility and its role differs with each company. As shown by Carroll (1999) when analyzing the range of definitions since 1950, there is no clear framework which is applied by everyone so far. Indeed, the range of definitions is wide. Dahlsrud (2006) conducted a literature review and tried to identify the different dimensions of CSR. He came up with five recurring ones: environmental, social, economic, stakeholder, and voluntariness. The analysis shows that with 97% probability at least three of these five dimensions are included in a random definition of CSR.

In 2019, the United Nations Industrial Development Organization (UNIDO) defined CSR as "a management concept whereby companies integrate social and environmental concerns in their business operations and interactions with their stakeholders. CSR is generally understood as being the way through which a company achieves a balance of economic, environmental and social imperatives ('Triple-Bottom-Line-Approach'), while at the same time addressing the expectations of shareholders and stakeholders."

2.2. Sustainable Investing

For most investors, profit maximization comes first (Halbritter & Dorfleitner, 2015). Traditional financial theory argues that companies should focus exclusively on maximizing shareholder value and have no further responsibility to act in the interests of stakeholders or society's welfare (Bénabou & Tirole, 2010; Friedman, 2007). According to the classic agency view, a commitment towards corporate social responsibility comes at the cost of financial performance, because resources are used for this purpose rather than for value-generating projects or shareholder payouts (Erhemjamtsa & Huang, 2019). On the contrary, Freeman (1984) argues that through effective stakeholder management, a firm can enhance its ability to achieve competitive advantage and long-term value creation; therefore, firms should invest in CSR. Within several studies the PRI (2015, 2016a, 2016b) even states that neglecting ESG issues in investment decisions is a breach of fiduciary obligations. Consequently, not only has sustainability become increasingly important within the management of companies, it is also of growing importance for investors.

Impact investing, socially responsible investing, ESG investing, sustainable investing: these terms all deal with the same objective - basing investment decisions not only on the performance of a company, but further including other ethical and responsible factors in the considerations. For investors it has always been difficult to make strategic resource allocation decisions and it has recently become even more so, as they are not only evaluated on financial performance anymore but also have to satisfy other expectations from society (Waddock & Graves, 1997). In recent years, it has become increasingly crucial for institutional investors to engage actively in ESG-related activities in their portfolio companies (Eurosif, 2013; Eurosif, 2016; Gifford, 2010). The market for sustainable investments has altered significantly. The number of US funds that incorporate ESG factors has risen from 55 in 1995 to 1,002 in 2016 (WRI, 2016). The first green bond was issued only slightly more than 10 years ago by the World Bank (World Bank, 2019). Rating agencies measuring the sustainability of companies appeared

on the financial marketplace only a few years ago, e.g., Sustainalytics in 1992 and Vigeo in 2002 (Sustainalytics, 2019; Vigeo Eiris, 2019). Approximately USD 30 trillion were invested in sustainable assets in 2018 (GSIR, 2018).

Investor Motivation

But where does this new trend come from? What is the motivation for investors to care about responsible and sustainable actions on the part of their investment companies? Should they not care only about the financial performance and the resulting return of their portfolio companies? Is it just about philanthropy or does ESG bring other benefits to the investors?

As the PRI (2017) states, SDGs (Sustainable Development Goals) are an unavoidable consideration for universal owners. The PRI (2019a) provides three reasons why responsible investments have been growing. The first is materiality: there is an increasing awareness within the financial community that ESG factors have an influence on a company's risk and return. Through their investments in companies, universal portfolio owners are exposed to growing economic costs. For example, being invested in companies operating in socially disruptive or highly polluting activities and thereby facing high external costs might have long-term financial consequences for the investors, by lowering the asset value. Considering environmental engagement is important for investors, as the companies otherwise have to spend huge amounts on insurance premiums, taxes, and costs deriving from disasters. Furthermore, companies operating in countries with high poverty and inequality will face the risk of social and political disruptions, which could result in worse financial results (PRI, 2017). The second is market demand - investors seek for more transparency and information about what kind of companies their money is invested in. The third - investors are facing a higher pressure from regulators to view ESG as part of their fiduciary duty towards clients and beneficiaries (PRI, 2019a). Consequently, there is a number of incentives for investors to engage with environmental and social aspects in their investments.

Hartzmark and Sussman (2019) were able to prove that sustainability rankings of mutual funds are influencing their investors through a natural experiment. As mentioned, it has always been difficult to assess sustainability objectively. Therefore, receiving data on the sustainability performance of mutual funds has been rather difficult. However, in March 2016, a solution was found by the launch of Morningstar, which published rankings of 20,000 funds on a scale from one globe (worst) to five globes (best). Hartzmark and Sussmann (2019) show that after this

ranking was published, funds with low sustainability rankings experienced a net fund outflow of over USD 12 billion, whereas those having high scores received an inflow of over USD 24 billion. Within the timeframe of 11 months, the highest rating ones managed to receive investments equaling ~4% of their fund size. In contrast, mutual funds with a low number of globes lost ~6% of their fund size due to outflows. This pattern strongly indicates that investors are valuing and assessing sustainability ratings. Three potential motives were discussed in the paper: institutional investors are obliged to value sustainability due to constraints received from their institutions, they see sustainability as a signal for higher future returns, or they value sustainability based on non-financial motives as altruism. Although they find no evidence for better financial performance, the belief of investors in it as well as non-pecuniary motives seem to be the main motivations for the incorporation of ratings in investment decisions.

A vast amount of research investigates the question whether higher ESG scores are interconnected with higher performance (see e.g., McWilliams & Siegel, 2000; Orlitzky et al., 2003). Nevertheless, the scientists are not yet in agreement on the issue. Some argue for a positive relationship between financial performance and ESG (e.g., Eccles et al., 2014; Orlitzky et al., 2003), whereas others prove the existence of a negative relationship (e.g., Aupperle et al., 1985). Another group finds no significant connection at all (e.g., Surroca et al., 2010). Moreover, there is the question of causality. Are companies more successful because they invest heavily in ESG, or do successful companies have the financial resources to optimize their ESG performance? Waddock and Graves (1997) show that the relationship is indeed a virtuous cycle where social performance appears to be both a predictor and a consequence of financial performance. Irrespective of the fact that the research body has no clear conclusion on the subject, the new trend has evolved. ESG scores have found their way into the investment decisions of the largest and most sophisticated investors (Eccles et al., 2017).

What might be an additional reason for this shift is the fact that firms with good CSR transparency and performance face fewer capital constraints (Cheng et al., 2014), which allows them to operate in a less restricted way. It also has been shown that stock and bond prices of companies that commit themselves to CSR in the event of negative headlines benefit from insurance-like effects. However, this effect is only a one-time protection and does not provide long-term coverage against negative events. It quickly disappears when facing the second, third or subsequent negative event (Shiu & Yang, 2015). Nevertheless, it is also beneficial for investors, as the loss in connection with a negative event will turn out to be less harmful for

them. Reducing the downside risk arising from poor ESG performance is critical to the active engagement of investors in ESG. A company performing particularly poorly on ESG issues could imply severe financial, legal, reputational, and operational risks (Blackrock & Ceres, 2015).

Besides the factors mentioned, the companies themselves have additional benefits, which also might be advantageous for investors over time. Research has shown that companies with a better commitment to sustainability might have access to better resources (Cochran & Wood, 1984; Waddock & Graves, 1997). Additionally, it has been found that the prospects of attracting qualified employees are higher (Turban & Greening, 1997), the company's reputation is enhanced (Fombrun & Shanley, 1990; Fombrun, 2005; Freeman et al., 2007), and the risk of regulatory, legal, or tax measures can be mitigated (Freeman, 1984; Berman et al., 1999; Hillman & Keim, 2001). From a customer perspective, reasons to invest in sustainable funds might be the hope that these will outperform the market or the willingness to pay a premium, as these investors value sustainability (Hartzmark & Sussman, 2019). Both of these factors are favorable for the investors.

ESG Performance Measurement

To be able to invest in sustainable assets, investors must have an information criterion which enables them to assess companies and their sustainability performance. Throughout the investor community a variety of strategies are applied for identifying sustainable companies in which to invest. The most popular one is negative screening, whereby companies or industries are eliminated that do not fit the requirements set up by the investor. In 2016, USD 15,023 billion of socially responsible strategies worldwide were invested based on this strategy. Second in popularity, representing USD 10,369 billion in 2016 was ESG integration, including ESG factors in the analysis. This strategy will be the main focus area of our thesis. Apart from that, a number of other tactics are available, including norm-based screening, best in class investment selection, impact investing, or sustainability themed investing (Eurosif, 2016; Global Sustainable Investment Alliance, 2017).

As mentioned, one of the most widely used sources is the ESG score, which stands for Environmental, Social and Governance. Several market players try to help investors by providing ESG scores, which help quantify the performance of the companies on these matters: On the one hand, the big commercial financial data providers including *Bloomberg*, *Thomson*

Reuters, and MSCI; on the other hand, players focused only on delivering ESG data, such as Sustainalytics and Vigeo Eiris. As all of them have developed their own frameworks and factors they consider when grading companies, their ratings differ. These differences arise because it is highly complex to compare the performances of companies of various industries and sizes in terms of responsible behavior. Because the ratings greatly diverge, studies based on them also lead to differing results (Berg et al., 2019).

Major Initiatives

The investment community is a powerful driver pushing companies to report on non-financial information, with big associations pressuring towards such as the Principles for Responsible Investment (PRI) or Sustainable Stock Exchange (SSE) initiatives (United Nations Global Compact, 2014). The PRI group, supported by the UN, is an investor initiative that serves as an independent supporter for those seeking to incorporate ESG factors into their investment and ownership decisions. So far, nearly 2,500 investment managers, service providers, and asset owners have signed an agreement including the six principles, which state (among other things) that they will incorporate ESG issues into their investment analysis and decision-making processes (PRI, 2019a; PRI, 2019b).

Another initiative from the UN Secretary General was the Sustainable Stock Exchange (SSE), which was set up in 2009 as a partnership program between the UN Conference on Trade and Development (UNCTAD), the UN Global Compact, the UN Environment Program Finance Initiative (UNEP FI), and the Principles for Responsible Investment (PRI). The SSE supports stock exchanges to encourage and promote sustainable investments. With this initiative they aim to make sustainable stocks more investable. So far, 90 out of 96 stock exchanges have joined the network by signing a voluntary commitment. The network consists of representatives of all capital market stakeholders such as stock exchanges, capital market regulators, and investors as well as companies. Through the support of SSE, 47 of these stock exchanges have already been able to offer a guide for issuers on how to report on ESG issues, and 24 even require ESG reporting as a listing rule (SSE, 2019). In recent years, these initiatives have made it much easier for investors to incorporate sustainability aspects into their decisions.

As shown in this section, sustainable investing is one of the most exciting financial topics of our time. It is therefore worth taking a closer look at how the world of investors deals with this topic and incorporates it into their decision-making, which we will do in the upcoming section.

2.3 Investor Types

In large public companies, ownership is primarily separated from management, which implies one of the dominant problems of organizations described by the agency theory. The agency theory holds a central role in the corporate governance literature and illustrates the fundamental discrepancy of interests in the relationship between the owners and the management of a firm, respectively the principals and the agents. Jensen and Meckling (1976) investigated this issue and indicated that related agency problems generate agency costs, which companies and their owners seek to reduce. A key element of their theory posits that it is relatively costly for outside shareholders to observe the management's actions. In addition, they analyzed the concentration of shares held by outside investors and found that large shareholders are better in monitoring the management than small shareholders, in terms of costs and efficiency, mainly because major shareholders have sufficient voting power to influence management decisions.

The financial market landscape encompasses various types of investors, with each of them having different demands and opinions about the companies in which they are invested. These conflicts of interests among the multiple shareholder types induce a challenge for managers, as they need to consider diverse interests. Therefore, top management prioritize their shareholders according to specific attributes such as power, legitimacy, and urgency (Agle et al., 1999). As a result, the investors' motivation to encourage companies towards higher sustainability standards differs, as well as their impact being limited to the relative power of each investor.

The extent to which the shareholders of a firm can exploit their interests is embedded in the framework of corporate governance. The latter is defined as "the ways in which suppliers of finance to corporations assure themselves of getting a return on their investment" (Shleifer & Vishny, 1997). In that sense, it describes the rules and regulations by which the management is expected to run a company. The predominant way of shareholders influencing the management activities in US corporations is exercised through proposals during the general annual meeting. The specific rules for the corresponding proposal process are set by the Securities and Exchange Commission (SEC). Accordingly, shareholders can exercise their voting rights to vote for the proposals. Besides submitting proposals, shareholders can ordinarily vote for the composition of the board of directors, which enables large shareholders to vote in favor of having their own board seat representatives. The board of directors is a core element in the decision-making process of a company. A seat on the board gives large shareholders the ability to influence the management and monitor its actions directly (Gillan & Starks, 2000).

Clearly, investor types are distinct from each other and are not even homogeneous within their own group. They differentiate themselves along various characteristics, such as investment horizon, value creation, risk preference, and investment strategy. With regard to this thesis, we focus on six investor classes according to their impact on ESG scores: states, institutional investors, individual investors, banks, corporations and pension funds.

2.3.1 State Ownership

State ownership refers to shares held by governments or government-related institutions. Corresponding investments are primarily undertaken by sovereign wealth funds (SWFs) and are typically financed by a nation's commodity export revenues or by assets traded directly from official foreign exchange reserves (Butt et al., 2008).

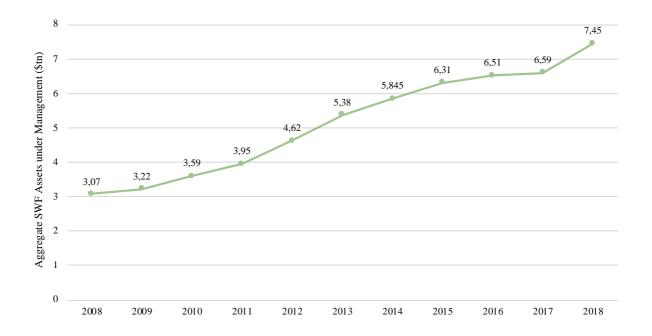
Of the several classes of sovereign wealth funds, the so-called stabilization funds represent the majority in terms of total assets under management. These funds are mainly managed by resource-rich countries, which aim to reduce their dependence on oil and save for future generations, as non-renewable resources will run out sooner or later. The *Government Pension Fund of Norway* (also known as the *Norwegian Oil Fund*) or the *Abu Dhabi Investment Authority* are prominent examples of stabilization funds. A second important group of SWFs are those funded by accumulated reserves primarily not related to commodities, such as the *China Investment Corporation (CIC)* or the *Singapore Government Investment Company (GIC)*. These funds exist mainly in Asia (Beck & Fidora, 2008). Sovereign wealth funds invest in a broad spectrum of assets and in most cases have a substantial exposure to foreign investments. Over the last decade, SWFs have recorded remarkable growth, creating a powerful actor on financial markets and in the global economy caused by their large size, with more than USD 8 trillion in assets under management (Sovereign Wealth Fund Rankings, 2019; see *Figure 1*).

Apart from investing for the purpose of saving for future generations, governments also participate in companies because specific firms might have a political and strategic value for the country (e.g., energy sector, arms industry, aerospace) or solely to support certain regions. Using direct investments by acquiring shares in these companies attempts to control significant industries, as well as to pursue other political goals. Developments towards sustainability might represent one aspiration (Klein et al., 2010). By acting in accordance with national interests, governments not only have a financial mandate but also an ethical one. The majority of

countries clearly aim to address environmental and social issues, which are often managed and regulated by taxation. However, governments also try to undertake actions towards sustainability via their portfolio investments (OECD, 2010).

Figure 1: Aggregate SWF Assets under Management

The figure shows the increasing amount of assets under management by sovereign wealth funds and thereby indicates their larger influence on the capital market. The figure is based on: The 2018 Preqin Sovereign Wealth Fund Review.



2.3.2 Institutional Ownership

Institutional ownership refers to shares held by institutional investors, such as hedge and mutual funds, private equity and venture capital funds, as well as brokerage firms and equivalents. Pension funds technically also belong to the group of institutional investors, but with respect to our thesis, we consider pension funds as their own group, due to their substantial size and influence on the financial markets and their corresponding long-term investment horizon. Institutional investors principally represent the largest category of shareholders investing a considerable part of their funds in the stock market. Their primarily goal is to achieve financial returns and manage the risks in the best interests of their clients (OECD, 2010).

In view of ESG performance, Butler and Wong (2011) state that institutional investors should have a strong motivation to encourage companies in the development of sustainability, arguing that institutional investors have a great responsibility due to their large size and their impact on capital markets. Jo and Harjoto (2011) indicated that institutional investors are positively

correlated with CSR engagement. For them, institutional investors are aware of the benefits that come along with improvements in CSR-related areas. However, institutional investors primarily invest with the expectation of positive financial returns to satisfy the demands of their clients. This could result in disregarding other, non-financially driven aspects, such as developments regarding sustainability (Dam & Scholtens, 2012).

2.3.3 Individual Ownership

Individual ownership refers to investments made by private individuals, which represents a specific group of investors. There are various reasons why economists tend to have a different view on individuals than on institutions. In particular, individuals are characterized as having behavioral biases, while institutions are considered to be well-informed investors (Kaniel et al., 2008). Due to the relatively large costs to obtain information, especially in relation to the limited size of their portfolio, individuals use much less information than institutional investors. In addition, most individual investors have neither sufficient understanding nor the capability to apply the recommended valuation methods used by institutions (De Bondt, 1998).

Individuals have various reasons for investing in stocks besides the motive of maximizing returns. Barber and Odean (2000) argue that some individuals might participate in the stock market because of the pure enjoyment of gambling. Sialm and Starks (2012) point at investors who are motivated primarily by tax incentives. However, with regard to this thesis, we focus on companies' top investors, who can be regarded as being well-informed and are often represented by families or insiders, such as the founders of a company. Their main goal is to preserve wealth in the family and transfer control to future generations. Thus, this group portrays a typical long-term investor (Stein, 1989).

In connection with CSR, family-controlled firms tend to respond more positively to normative forces; consequently, they exhibit a higher sustainability performance than their nonfamily-controlled counterparts. For them, the conservation of socio-emotional wealth (such as reputation) has a significant role in their strategic decisions. In contrast, stock ownership by insiders, particularly the CEO, impacts CSR performance negatively, since compensation is usually based on the firm's financial performance (Berrone et al., 2010; Block & Wagner, 2011). McLachlan and Gardner (2004) indicated that substantial differences exist between a socially responsible investor and a conventional one with regard to their beliefs and perceptions of moral intensity - and, consequently, to their investment decision-making.

2.3.4 Bank Ownership

Banks have several benefits from equity investments in companies. They can profit from promising financial returns instead of receiving merely the conservative debt payoff. Moreover, they have a better capability in monitoring the potential borrower and its management, which reduces agency costs and default risk. Lastly, banks can obtain additional information and establish a closer relationship to the counterparty. Occasionally, banks own shares in a company because they combine lending with a direct investment. However, in most cases the financial motives are the predominant reason for banks holding shares in other companies (Allen & Santomero, 1997; Diamond, 1984).

With regard to ESG performance, banks have a substantial impact on society due to their important role as financial intermediaries. They price and value assets, monitor borrowers, manage financial risks, and organize our payment system (Greenbaum & Thakor, 2007). In order to fulfill their function, banks require a certain behavior from companies and individuals. Accordingly, Cowton and Thompson (2000) argue that banks are under an obligation to require sustainable behavior from their customers, due to their unique position in the capital market. Scholtens (2009) investigated how banks deal with corporate social responsibility and illustrated that the awareness of banks in relation to social responsibility has improved significantly in recent years. This might be a result of the increasing importance of reputation for banks, which is a crucial factor for attracting new customers and retaining old ones. Clearly, a positive CSR appearance affects the reputation of a bank and how it is recognized by potential customers, who are increasingly concerned about environmental, social, and governance issues (Tran, 2014).

2.3.5 Corporate Ownership

Corporate ownership relates to shares held by firms. Apart from the prospect of purely financial returns, strategic decisions such as promising mergers and acquisitions (M&A) are dominantly the reason for companies investing in other firms (Dam & Scholtens, 2012). However, the fact that takeovers mainly result in abnormal negative returns for the acquirer indicates that the financial component might not be the predominant driver of these investments (Andrade et al., 2001). While the shareholders of the target company usually enjoy positive returns, investors of the acquiring firm frequently experience a loss. Several studies investigated this phenomenon and attempted to provide explanations for why companies continue to invest in other firms despite the value destruction. Seth et al. (2000) found that managers undertake acquisitions not only on behalf of the underlying value maximizing motive. Evidence suggest that executives

might engage in mergers with the intention of managerial empire building. In addition, managers oftentimes overvalue their target company due to overconfidence (Doukas & Petmezas, 2007). Nevertheless, the main objectives of mergers and acquisitions are strategic ownership motives, representing the interests of the acquiring shareholders. For example, the efficiency theory posits that mergers are undertaken to achieve synergies and thus to create value (Trautwein, 1990).

With regard to corporate investments and CSR, companies increasingly incorporate the sustainability aspect into their decision-making process. This is done either voluntarily as part of their strategy or as a reaction to growing pressure from activist shareholders (Deng et al., 2013). In addition, the branding motive represents an issue that should be considered. By investing in another firm with a good reputation, the acquirer also expects a positive effect on their own reputation (Becker-Olsen et al., 2006; Delgado-García et al., 2010). However, it is unclear how important these factors are in a M&A process. Dam and Scholtens (2018) argue that sustainability concerns represent only a subordinate role in the decision-making process of potential acquirers.

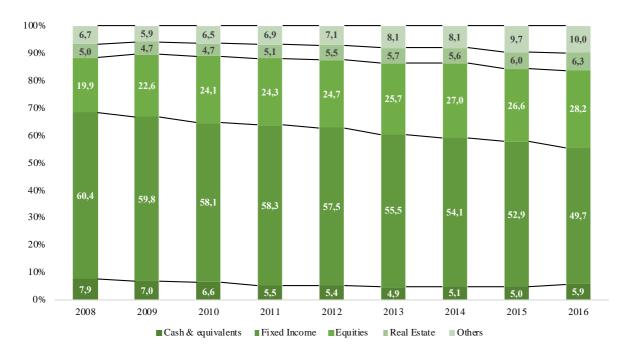
2.3.6 Pension Fund Ownership

By pooling social risks, pension funds act as an insurance and provide income in times of retirement. Corresponding to hedge funds, mutual funds, and equivalent investors, pension funds can be assigned to the class of institutional investors, which principally invest to achieve financial returns and to manage risks on behalf of their ultimate investors (OECD, 2017). As one of the largest providers of capital, with total assets of more than USD 16 trillion under management, pension funds represent a major actor on the financial market (Public Pension Rankings, 2019). Hence, they are in a unique position to have a significant impact on market participants. Pension funds primarily pursue their power by submitting shareholder proposals.

Traditionally, global pension funds have invested heavily in fixed income such as government and high-quality corporate bonds. However, driven by the current structural low interest rate environment, funds have begun shifting their investments towards equities and alternatives over the last few years, therefore increasing their direct impact on portfolio companies as well (State Street Global Advisors, 2018; see *Figure 2*).

In regard to sustainability, several studies argue that firms benefit in the long run by investing in CSR. Accordingly, as typical long-term investors, pension funds should be interested in their portfolio companies moving towards more sustainability. Cox et al. (2004) established that long-term institutional ownership is positively related to CSR. Moreover, Neubaum and Zahra (2006) investigated the relationship between US state pension funds and CSR performance and identified a positive effect. In contrast, other studies have documented a negative relation or none at all between pension funds and CSR performance - suggesting that, in investment decisions, funds are predominantly driven by financial factors and less by CSR considerations. Furthermore, they argue that managers of pension funds lack expertise with corporate management (Barnea & Rubin, 2010; Del Guercio & Hawkins, 1999; Schneider & Cox, 2010).

Figure 2: Pension Fund Investments
Shifting focus of pension funds from Fixed Income towards Equities. This figure is based on a 2018 report of State Street Global Advisors: How do Public Pension Funds invest?



2.4 Ownership Concentration

Various previous studies have investigated the effect of ownership concentration on corporate governance. Nevertheless, views regarding this issue differ. On the one hand, Jensen and Meckling (1976) claim that large shareholders can monitor the management at lower costs and more effectively. Majority shareholders have greater incentives in controlling and monitoring the management, as they benefit the most from the mitigation of agency problems. Therefore, ownership concentration can prevent managers from exploiting firm resources to satisfy their

own personal interests (Shleifer & Vishny, 1986). Demsetz and Lehn (1985) observed that with increasing concentration of ownership, the degree to which costs and benefits are born rises, in a way that major shareholders are more likely to be active in corporate governance to prevent information asymmetries. Accordingly, large shareholders attempt to mitigate the relatively high risk associated with their large holdings in a company and to benefit financially from the reduced agency problem.

On the other hand, shareholder concentration can also give rise to severe agency conflicts. In particular, Barclay and Holderness (1989) suggested that large shareholders might use their power to secure private benefits, which are not in line with other shareholders' interests. In that sense, company resources are not distributed efficiently amongst all shareholders, and at the expense of shareholders with lower stakes in a firm.

On the context of sustainability, existing studies are inconclusive as well. Dam and Scholtens (2013) investigated the relationship between ownership concentration and CSR amongst European multinational firms and found ownership concentration to be significantly related to CSR policies. In addition, they determined that CSR performance is negatively associated with concentration, indicating that CSR performance deteriorates with more concentrated ownership. According to them, corporate social performance can be viewed as the private provision of a public good. Large shareholders are not willing to pay a relatively high price for social performance to the benefit of all others and to the detriment of their own financial performance. This attitude can be explained by the "free-rider problem" in which the effort of one large shareholder is enjoyed by many other minority shareholders (Grossman & Hart, 1980). Hence, this effect might inhibit the efforts towards sustainability improvements. However, Anderson and Reeb (2003) argue that majority shareholders are interested in the long-term survival of the firm and care considerably about their own reputation, which is strongly associated with that of the firm. Thus, they are more willing to engage in the company's social and environmental performance to conserve their reputation and to benefit from the positively associated, long-term impact of CSR on the firm's performance.

3. Research Question and Hypotheses

As we discussed in chapter 2, there are substantial differences between investors. Various ownership types have differing roles and responsibilities in society, follow different investment objectives, and have access to different information channels (Lopatta et al., 2017). The investor's strategy and the horizon of the investment, as well as other characteristics, highly influence the commitment within the invested companies to foster sustainability. Thus, the following research question can be formulated:

"What influence does the ownership structure have on the ESG score?"

In order to address this research question, and considering previous research, we have formulated seven hypotheses to test. As outlined before, every ownership type comes with different characteristics. Hence, we expect the manner and the intensity of how each investor type engages in ESG related issues to be heterogeneous. The relationship between the type of owner and ESG could be either negative, positive, or neutral. Based on our extensive literature research and our own considerations, we formulate the following hypotheses.

The first area warranting further analysis is the relationship between state ownership and ESG performance. The state has to face many conflicting goals (Dam & Scholtens, 2012). As Bénabou and Tirole (2010) state, moral values are decisive too when making investment considerations. This might be of particular importance for a state investor dealing with the high ethical expectations of society. In line with Klein et al. (2010), we argue that sustainability might represent one intention. Consequently, our first hypothesis is the following:

Hypothesis 1a: State ownership has a positive influence on ESG score.

Investors that are potentially predominantly driven by financial motives, such as institutional investors, focus extensively on firm value and will therefore assess every CSR investment made by the company more critically (Dam & Scholtens, 2012). Neubaum and Zahra (2006) found that short-term institutional investors are associated negatively with CSR engagement.¹ Following the argumentation that the predominant goal for institutional investors is to

¹ It is important to mention that we did not include typical long-term institutional investors such as pension funds and insurance companies in the class of institutional investors when formulating this hypothesis; rather, we separated them into their own class.

maximize profits and manage risk for their clients and themselves (OECD, 2010), the following hypothesis can be stated:

Hypothesis 1b: Institutional investors have a negative influence on ESG score.

The characteristics of the several types of individuals differ. However, as stated earlier, in the context of this thesis we define individual owners as well-informed family or insider investors. Nevertheless, individual investors are far more restricted in their ability to gather information and process it than large institutional investors, as individual investors mostly have a limited portfolio size and risk capacity (De Bondt, 1998; Van der Burg & Prinz, 2006). We assume that some individual investors certainly engage in CSR. However, we follow the report published by Eurosif (2018), which concluded that sustainable encouraged investments made by individuals are growing but still make up only a small fraction of the overall investments. Therefore, we hypothesize:

Hypothesis 1c: Individual ownership does influence ESG score in a negative way.

Since banks and financial institutions are only intermediaries who manage their clients' money on the basis of their wishes and risk requirements (Dam & Scholtens, 2012), they mainly aim to adapt their strategy towards market demands. Hence, we believe that, as the requests for sustainable investments is increasing, banks and trusts engage in these matters in their portfolio companies. We assume that banks benefit substantially from improvements in CSR, as it reduces information asymmetries and downside risks. Hence, in line with the findings of Lopatta et al. (2017), our next hypothesis is the following:

Hypothesis 1d: Banks have a positive influence on ESG performance.

As argued before, the main motive for corporations to invest in other companies is mergers and acquisitions (Dam & Scholtens, 2012). If companies with a higher sustainability performance want to merge with their respective investment, they might already have experienced positive outcomes from CSR engagement, which could lead to an increased awareness of CSR regarding their investment company as well. Companies that perform better have superior access to resources (Cochran & Wood, 1984; Waddock & Graves, 1997), have enhanced reputations (Fombrun & Shanley, 1990; Fombrun, 2005; Freeman et al., 2007), and mitigate the risk of

regulatory, legal, or tax measures (Berman et al., 1999; Freeman, 1984; Hillman & Keim, 2001). However, since strategy considerations (e.g., achieving synergies) are the predominant objectives in mergers and acquisitions, we assume that sustainability aspects represent only a subordinate part in the decision-making process of M&A activities (in particular, since CSR engagement is still regarded as costly by many companies). Therefore, we posit:

Hypothesis 1e: Corporate ownership has a negative influence on ESG performance.

As shown by Cox et al. (2004) and Neubaum and Zahra (2006), long-term institutional investors seem to influence CSR in a positive way. Pension funds can be considered as the typical long-term investor. Consequently, we argue that due to their long-lasting commitment, pension funds are particularly interested in avoiding risks. As outlined before, a lack of integration of sustainability aspects into corporate management bears a number of risks (PRI, 2017). Due to their long investment period, we would therefore expect pension funds to be exceptionally concerned about these risks and hypothesize the following:

Hypothesis 1f: Pension funds have a positive influence on the ESG performance.

The impact of ownership concentration is the subject of conflicting arguments. If the shares in a company are widely distributed and the various shareholders have different intentions (one fund might be seeking to maximize profits while another is socially motivated), different approaches meet each other and no party can fully realize its interest. In order for the impact investor to be able to pursue social goals, she must hold a large enough claim (Chowdhry et al., 2019). Thus, if an owner places a focus on ESG, concentration is advantageous. On the contrary, Calza et al. (2016) find evidence that ownership concentration has a negative influence on environmental proactivity. If an investor holds a substantial share in a company, an investment in environmental activities benefits all other shareholders, whereas the costs are mostly carried by her and to the detriment of her financial profit. One could argue that if an investor is holding a large number of shares, she would rather engage in reducing the money that is spent in respect to improved ESG activities. In line with the findings of Calza et al. (2016) and Dam and Scholtens (2013), we hypothesize as follows:

Hypothesis 2: Concentration has a negative influence on ESG performance.

4. Data and Methodology

The following chapter first describes the process of data generation. Furthermore, the composition of the sample is outlined and the research design applied to test our hypothesis is presented. The chapter concludes with providing details about the variables used in our model.

4.1 Data Collection

For the scope of our analysis, we considered a dataset with all companies that were part of the S&P~500 during the period from 01.01.2010 to 31.12.2018. Accordingly, we also included observations of companies that were not part of the S&P~500 during the whole sample period, as we wanted to avoid a survivorship bias.² This provided a record of 735 companies for each of the nine years. The sample was created by matching ESG data with ownership data. We retrieved all relevant ownership and company data from *Thomson Reuters* (*Eikon*).³ The ownership data contains information about the owners, the percentages each owner held as well as the type of investor. Furthermore, we extracted data regarding a company's industry, return on assets, age, size, and leverage to pursue further analysis.

Regarding ESG data, *Bloomberg, Thomson Reuters, Sustainalytics, Vigeo Eiris* and *RobecoSam* are frequently used sources. As for the company data, we decided to use the *Thomson Reuters* database to retrieve ESG data. *Thomson Reuters* provides data on over 7,000 companies globally going back to 2002 and thereby covering 70% of the global market cap (Refinitiv, 2019).

This paper focuses on the S&P 500 for several reasons. First, due to the large size of the companies included, the index is one of the best representations of the U.S. stock market and thus has a significant impact on global financial markets. Second, due to its importance, more data is available, especially with regard to ESG scores. Finally, the US market is the most important single country market in terms of sustainable investments (GSIR, 2018).

² Survivorship bias is the tendency to consider the performance of existing stocks or funds in the market as a representative ample without taking into account those that have gone bankrupt. Distortion of survival may lead to overestimation of the historical performance and general attributes of a fund or market index (Brown et al., 1992).

³ Thomson Reuters (Eikon) is a multinational media and financial information provider.

4.2 Sample Description

This section is intended to provide a concise and comprehensive overview of the data used in the subsequent models for the purpose of testing the hypotheses stated in chapter 3. We expect a change in the ownership structure to not have immediate influence on the ESG score. Rather, we assume that it takes the investor at least one year to have an impact. Consequently, we match the ownership data with the ESG data from one year afterwards. In that sense, our dataset for the investors includes observations from 01.01.2009 until 31.12.2017, whereas the dataset for ESG scores was collected during the time period 01.01.2010 to 31.12.2018. As a result, we had a total of 6,615 observations (735 companies times 9 years). Nevertheless, the *Thomson Reuters* dataset did not provide comprehensive information for all companies. Hence, we had to exclude 1,239 observations due to lacking ESG scores and 97 observations due to missing ownership information. Furthermore, 579 observations had no sufficient control variable information and were therefore excluded as well. Our final sample consists of 4,700 observations. For each company, the accumulated shareholdings of the 30 largest owners have been aggregated into seven classes. Please see *Table 1* for the sample derivation information.

Table 1: Sample Derivation Company DataThe table displays the process of the sample construction. The final sample consists of 4,700 observations after missing values were deleted.

Sample Derivation	
Initial observations	6,615
Excluding the ones without ESG score	- 1,239
	5,376
Excluding the ones without ownership data	- 97
	5,279
Excluding the ones with missing control variables	- 579
Final Sample	4,700

In our initial dataset, the observations of investors were categorized into 15 different types. Please see *Table 2* for a comprehensive list and the occurrence of each type. Investment advisors as well as hedge funds are by far the most prominent investors in our sample, whereas some other investor types occur rarely, such as institutions or government agencies. These investors were later classed together to a heterogenous group (see in more detail chapter 4.4.2).

Table 2: Investor Types by Categories⁴

The table illustrates the number of observations per investor type. All investor types with less than 10 observations have been deleted, as no meaningful conclusions can be drawn.

Investor Types	
Investment Advisor/Hedge Fund	64,330
Investment Advisor	52,938
Hedge Fund	8,626
Pension Fund	5,906
Research Firm	4,199
Sovereign Wealth Fund	3,884
Individual Investor	2,505
Bank and Trust	1,558
Insurance Company	773
Corporation	485
Private Equity	143
Foundation	102
Venture Capital	47
Holding Company	45
Other Insider Investor	12
Total	145,553

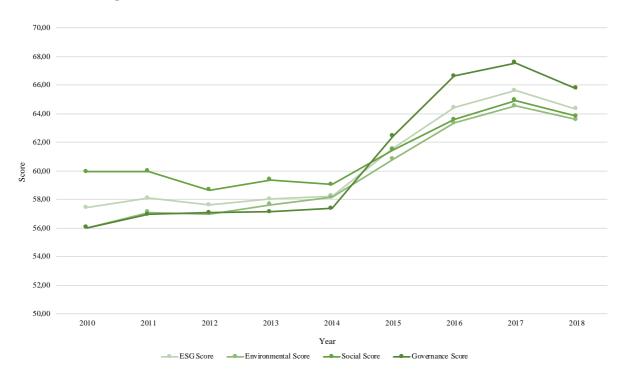
Figure 3 provides an overview of the evolution of the average total ESG, Environmental, Social, and Governance scores over the observation period. As can be observed, there is a clear trend towards rising scores, which confirms our previously formulated statements that companies more and more are incorporating sustainability aspects into their decision-making process. While the scores stayed nearly constant until 2014, an intense increase can be observed in the past few years. One potential reason for the decline in scores in 2018 might be the fact that not all ESG data for this year has been reported yet and therefore the sample was smaller.

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⁴ The rationale for the observations in *Table 2* being much higher than in *Table 1* is the accumulation of ownership data into classes.

Figure 3: Development of the Scores over the Dataset

The figure shows the average for ESG, Environmental, Social and Governance score in our dataset over the period 2010 to 2018.



4.3 Research Design

This section is intended to provide a concise description of the methodology used to answer our research question and to check the hypotheses stated in chapter 3. First, we introduce the model used to test whether the ownership structure has an influence on the ESG score: a *fixed effects model* has been established, with the ESG score as the dependent variable and the different ownership types as the explanatory variables, while fixing industries as well as time and firm effects. Described in chapter 4.3.2, a second model to test the dependency on ownership concentration was set up using ownership concentration as the independent variable.

4.3.1 Testing the Impact of Ownership Type

We use a regression analysis to test the relationship between the various independent variables (ownership type) and the measurers of *total ESG scores*, as well as the individual scores for environmental (E), social (S), and governance (G) performance. Several models exist in order to avoid misleading and unobserved variable biases that come from traditional panel data. In particular, a natural problem in panel data is endogeneity, which can be described as correlation between the explanatory variables and the error term (Wooldridge, 2002). Commonly used models that address issues related to panel data are the *random effects model* and the *fixed effects model*. With regard to our estimation model, we will use a *fixed effects model* (also

known as the least-squares dummy variable model or LSDV) because a specific assumption of the *random effects model* is that the unobserved effect α_i is uncorrelated with each explanatory variable: $cov(x_{it}, \alpha_i) = 0$ (Wooldridge, 2002). However, we assume that this assumption does not hold, as we consider industry effects to be correlated with at least one explanatory variable.⁵ For example, we presume industry to be correlated with leverage, since riskier industries commonly exhibit a lower leverage. Thus, we will initially use a *fixed effect model* with industry as the fixed effect estimator to account for heterogeneity between the industry characteristics (see *Table 12* in chapter 7 for all industries). In addition, we add time fixed effects and firm fixed effects in further models to control our sample data for time- and firm-specific characteristics. As mentioned before, the dependent ESG scores and the individual sub scores, as well as all the control variables, are lagged by one year, since we presume that shareholders need a certain time to have an actual impact on a company's sustainability performance. To investigate the relationship between the type of ownership and ESG performance, we estimate the following initial model:

(1)
$$Total\ ESG\ Score_{it} = \beta_1 Bank_{it-1} + \beta_2 State_{it-1} + \beta_3 Corporation_{it-1} + \beta_4 Individual_{it-1} + \beta_5 Institutional_{it-1} + \beta_6 PensionFund_{it-1} + \beta_7 Others_{it-1} + \beta_8 log(MarketCap)_{it} + \beta_9 Leverage_{it} + \beta_{10} ROA_{it} + \beta_{11} FirmAge_{it} + \alpha_i + v_{it}$$

where $total\ ESG\ score$ is the firm-specific assessment regarding sustainability performance. The variables Bank, State, Corporation, Individual, Institutional, PensionFund, and Others represent the independent variables and are measured by the percentages held in a specific company by each class of owner. We aggregate the shareholdings by ownership class, which means that if two banks each have a share of 15 percent in a firm, the variable Bank will have the value 30 percent related to that firm. The variables MarketCap, Leverage, ROA, and FirmAge serve as the control variables and are measured by a company's market capitalization, leverage, return on asset, and years since company incorporation, respectively. The α_i represents the specific fixed effect estimator that captures heterogeneity across industries, firms and time; v_{it} reflects the error term. As mentioned before, all variables (dependent, independent, and control variables) are built based on data retrieved from $Thomson\ Reuters$.

⁵ Wooldridge (2012, p. 493) contends "In many applications, the whole reason for using panel data is to allow the unobserved effect to be correlated with the explanatory variables".

4.3.2 Testing the Impact of Ownership Concentration

In order to establish whether the sample exhibits effects due to ownership concentration (*Hypothesis 2*) we set up another model. Again, we consider an unobserved effect that leads us to include industry as the fixed effect estimator. In addition, we control the data for time-invariant characteristics, adding a time fixed indicator in a further model. As the measure of concentration, we apply the *Herfindahl-Hirschman Index* (please see chapter 4.4.2 for a detailed reasoning). The other variables adhere to the previous model. Therefore, the following equation was established to determine the relationship between ownership concentration and ESG score:

(2)
$$Total\ ESG\ Score_{it} = \beta_1 HHI_{it-1} + \beta_2 log(MarketCap)_{it} + \beta_3 Leverage_{it} + \beta_4 ROA_{it} + \beta_5 FirmAge_{it} + \alpha_i + v_{it}$$

where *total ESG Score* is the firm-specific assessment regarding sustainability performance. HHI stands for the *Herfindahl-Hirschman Index*, which measures ownership concentration and represents the independent variable. *MarketCap*, *Leverage*, *ROA*, and *FirmAge* serve as the control variables, while α_i represents the fixed effect estimator and v_{it} reflects the error term.

4.4 Variable Description

The following chapter gives a detailed description of all variables used in the regression model above. Furthermore, a motivation for the selection of the chosen variables is provided.

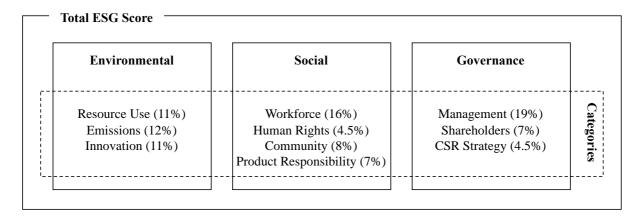
4.4.1 Dependent Variables

As mentioned before, quantifying sustainability through ESG scores is not an easy exercise and ratings vary widely. The companies are rated on both percentages and letters from D- to A+ (see *Table A* in Appendix for a definition of the score ranges).

The *total ESG score* consists of three different pillars, each of which are self-separated into several scores, resulting in a total of over 400 different ESG measures analyzed to generate the score for a company. For our purpose, we decided to focus on the *total ESG score* as well as on the three subscores - *Environmental, Social, Governance*. As seen in *Figure 4*, each of the three pillars in itself contains several scores with different weights.

Figure 4: Thomson Reuters ESG Score Calculation

The figure below illustrates the composition of the total ESG score, as well as of its subscores. The figure is based on Refinitiv 2019.



The environmental score measures how efficiently the company shifts towards eco-efficient solutions in its supply chain (Resource Use), and whether it is committed and effective regarding the reduction of emissions (*Emissions*). Furthermore, it measures the firm's capacity to reduce environmental costs and burdens for its customers through new solutions (*Innovation*). The social score consists of four categories. First, the company's performance on offering a good place to work is measured by job satisfaction of its employees, as well as by an assessment of safety, diversity, and development aspects (Workforce). Additionally, it is checked whether the company complies with human rights conventions (*Human Rights*). Also, the commitment towards being a good citizen, protecting public health, and adhering to business ethics is assessed (Community). A firm should furthermore produce quality goods and services, integrating the health, safety, integrity, and data privacy of the customer (*Product Responsibility*). Within the Governance part, the company is also assessed on how committedly and effectively it incorporates corporate governance best practices in its management (Management). Companies treating shareholders equally and using effective anti-takeover devices receive higher scores (Shareholder). Lastly, companies should incorporate the ESG dimensions in their day-to-day decision-making processes (CSR Strategy) (Refinitiv, 2019).

4.4.2 Independent Variables

To test *Hypothesis 1a-f*, the ownership type serves as the independent variable. In our original dataset, the investors were classed into 15 different types. These 15 investors types were grouped into 7 classes based on their respective characteristics; namely, *Bank, State, Corporation, Individual, Institutional, PensionFund*, and *Others*. All shares held by institutional investors such as hedge funds, private equity, and investment companies are

classified as *Institutional*. Due to their size and their particular importance for the capital market, pension funds are allocated to their own class, although they also belong to the institutional investor class. Governments participating in the capital market in the form of sovereign wealth funds were grouped into the *State* class. On the basis of varying investment objectives, *Corporation* was set up as another class. Research firms have been included into the class *Bank* as our analysis of the data has shown that all research firms are banks. All further observations have been assigned to the residual group: *Others*. This group contains a large number of diverse and heterogeneous investor types. Please see *Table 3* for the detailed investor classification.

As a first step the weight of the investor classes for each company was calculated as the sum of the shares held by the investor types included in the respective class. Afterwards, to make it easier to interpret the results, the shares within each investor type have been standardized.

Table 3: Investor Classes and Types

The table below illustrates our classification of the 15 investor types into 7 different investor classes. The class Others is a heterogenous group of investor types which are not clustered based on any specific characteristics.

Investor Classes	Investor Types		
DI-	Bank and Trust		
Bank	Research Firm		
State	Sovereign Wealth Fund		
Corporation	Corporation		
In dividual	Individual Investor		
Individual	Other Insider Investor		
	Investment Advisor/Hedge Fund		
	Investment Advisor		
Institutional	Hedge Fund		
	Venture Capital		
	Private Equity		
Pension Fund	Pension Fund		
	Insurance Company		
Others	Holding Company		
	Foundation		

As the independent variable for the second model (*Hypothesis 2*) we chose the *Herfindahl-Hirschman Index (HHI)*, since it is a widely used measure of concentration. For example, institutions as the *Department of Justice* or the *Federal Reserve* use it as a measuring index of competitive effects of mergers. Calculated as the sum of squared market shares of the participants in a market, the *Herfindahl-Hirschman Index* can range from zero to 10,000, with

10,000 being a single owner holding 100 percent if the ownership is given as a percentage (Rhoades, 1993).

(3)
$$HHI = \sum_{i=1}^{N} a_i^2 \text{ with } a_i := \frac{x_i}{\sum_{j=1}^{N} x_i}$$

4.4.3 Control Variables

In line with previous literature that have investigated the effect of the type of ownership on a company's ESG performance, we perceive the following control variables to be important: size, performance, risk, age, and industry type (see Dam & Scholtens, 2012; Neubaum & Zahra, 2006; Johnson & Greening, 1999). Therefore, we use market capitalization, return on asset, and leverage as well as years since company incorporation. Industry type, time and firm are used as the fixed effect estimators. Size, which is measured by market capitalization, is of particular relevance, as studies have proven that smaller companies are less concerned with ESG. Waddock and Graves (1997) argue that larger firms attract more attention and need to disclose sustainable relevant information to a greater extent to meet shareholder demands. Gallo and Christensen (2011) suggest that only large firms are able to fully incorporate CSR activities, since it requires a sufficient amount of resources to engage in CSR. In order to ensure linear relationships, the natural logarithm has been applied for the variable market capitalization (Wooldridge, 2012).

We also controlled for a company's leverage, measured by total assets divided by total equity. Waddock and Graves (1997) highlight that firms in distress are more focused on short-term goals such as profit maximization instead of investing in long-term projects such as CSR engagement. In addition, companies in financial distress have very limited opportunities to engage in traditional CSR topics, such as philanthropy.

We use return on assets, as prior studies have indicated a relationship between ESG and financial performance (Orlitzky et al., 2003; Scholtens, 2008; Waddock & Graves, 1997). Company age (measured by the years since incorporation) is another control variable, which we include since it has a substantial influence on a company's characteristics - such as the relationship to stakeholders and the company's reputation. Mature firms have more reputational capital, which additionally is more likely to be stable compared to younger firms (Flanagan & O'Shaughnessy, 2005). A certain amount of time is also needed to establish CSR instruments in a company (Withisuphakorn & Jiraporn, 2016).

Finally, industry, time and firm are used as the fixed effect estimators to control for specific heterogeneities of firms. The industry is particularly important, since ESG performance depends substantially on industry characteristics (see *Table 12* in chapter 7).

5. Empirical Results

In the subsequent chapter, the findings obtained when applying the previously described models are discussed. The structure follows the order of the hypotheses as laid out in chapter 3.

5.1 Descriptive Statistics

Table 4 reports the descriptive statistics of the dependent variables related to their respective ESG scores and control variables. The calculations in *Table 4* include all observations whenever a specific ownership class is invested in a company in a particular year (i.e., for each investor type an own subsample is used). For instance, if a bank and a pension fund are invested in a specific firm, the firm's ESG score is included in the calculations for each of the two investor classes.

Table 4: Descriptive Statistics by Investor Classes⁶
The table below provides descriptive statistics about ESG score and the control variables by each investor class.

INVESTOR CLASS	Bank	State	Corporation	Individual	Institutional	Pension Fund	Others	Total Sample
Mean ESG	62.044	61.517	55.021	54.468	60.408	61.595	67.234	60.412
Min ESG	13.346	8.600	16.265	16.664	8.600	8.600	17.475	8.600
Max ESG	94.485	97.898	88.715	94.485	97.898	97.898	97.898	97.898
StdDev ESG	16.146	16.470	16.237	17.127	16.620	16.414	16.889	16.620
Mean ROA (in percentage)	8.798	8.707	8.772	10.328	8.602	8.712	9.052	8.601
Mean Leverage	5.222	4.420	4.304	4.595	5.115	5.033	4.633	5.114
Mean MarketCap (in USD bn)	36.397	34.009	25.363	24.192	30.636	33.811	65.388	30.636
Mean FirmAge (in years)	36.907	35.924	24.808	31.580	34.046	34.835	48.932	34.039
N	3170	3606	395	1461	4699	3949	774	4700

The average ESG score of the whole sample data is 60.41, with a standard deviation of 16.62. Companies in which individuals or corporations are invested show a quite low average ESG score of 54.47 and 55.02, respectively. It appears that these investor classes might have a negative impact on a company's ESG performance. In contrast, companies in which banks, states, or pension funds are invested show an average ESG score that is above the total sample mean. This indicates a potential positive impact of these groups. *Table 4* gives evidence that the investor classes differ regarding the control variables as well. For example, while the market capitalization for companies with corporations and individual investors is ~ USD 25 billion, it is ~ USD 36 billion for banks. It seems that banks are invested in larger companies.

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⁶ Since the ESG score of one company is used in the statistical calculations for several investor classes, the summarized observations are considerably higher than the overall observations of our sample. For instance, if a bank and a pension fund are invested in the same company, the company's ESG score counts for one observation of each investor class. However, in the total sample the ESG score of that company only counts for one observation.

5.2 The Influence of Ownership Type (Hypotheses 1a-f)

Our regression results are depicted in *Table 5*. The findings indicate a statistically significant relationship between the various ownership types and ESG performance. We see that the control variables for size, and firm age exhibit the expected signs. We find a strong and significant positive relationship between size, measured by market capitalization, and total ESG score in all models. Since larger companies presumably attract more public attention and also have greater resources to engage in CSR, their scores seem to be considerably higher (Gallo & Christensen, 2011; Waddock & Graves, 1997). Firm age has a significant positive impact on ESG performance in all models, as we expected. It presumably requires a certain time to establish CSR instruments in a firm, and younger firms first need to build up these mechanisms (Withisuphakorn & Jiraporn, 2016). The control variable for performance, measured by return on assets, has a statistically significant and negative effect in all models, which is contrary to our expectations. However, Friedman (1970) argues that engagements in CSR are rather costly for a company and might reduce competitiveness, which might negatively affect financial performance. Risk, as measured by leverage, is insignificant in model (1) and (2). Thus, we excluded leverage as a control variable in further models to see the true marginal effects of the other variables.

With regard to the various ownership types, we find in model (1) that the variable *Others* is not significant (t = -1.357, p > .1), which is what we expected. Since this class only contains a large number of diverse and heterogeneous investor types, no conclusions can be drawn. Consequently, we excluded the variable *Others* in all further regression models.

We find a significant and positive relationship between state ownership and ESG performance in all models except model (5). However, that model only accounts for firm and time fixed effects, which is an imprecise assumption, since ESG scores do not vary substantially over time for a specific firm. The poor fitting of model (5) can also be observed by the significantly lower R². Our finding of a positive relationship is in line with our expectation (*Hypothesis 1a*). States act on behalf of national interests, which clearly include ethical and moral aspects. Accordingly, we see that governments on average seem to promote corporate social responsibility through their investment portfolios.

Table 5: Ownership Type and ESG Performance

The analyzed data sample contains 4,700 observations. The table shows the outcomes of several fixed effects regressions of ownership type on ESG performance including several control variables. In model (1) to (3) only industry fixed effects were applied. Model (4) accounts for industry and time fixed effects whereas model (5) only accounts for firm effects. For brevity, industry, firm and time fixed effects (dummy variables) are not reported. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%) and *(10%) levels.

VARIABLES	(1) ESG Score	(2) ESG Score	(3) ESG Score	(4) ESG Score	(5) ESG Score
Corporation	-1.732***	-1.684***	-1.686***	-1.760***	-0.787**
•	(-6.461)	(-5.979)	(-5.981)	(-5.990)	(-2.547)
Institutional	-2.339***	-2.232***	-2.223***	-2.416***	-0.268
	(-4.866)	(-4.435)	(-4.462)	(-4.738)	(-0.894)
Individual	-1.719***	-1.686***	-1.687***	-1.712***	-0.575*
	(-3.137)	(-3.095)	(-3.085)	(-3.134)	(-1.792)
Bank	-0.268	-0.237	-0.233	-0.375	-0.567**
	(-0.760)	(-0.669)	(-0.662)	(-1.015)	(-2.395)
State	0.803**	0.810**	0.808**	0.598*	0.489
	(2.183)	(2.156)	(2.147)	(1.708)	(1.297)
Pension Fund	-0.494**	-0.465*	-0.463*	-0.418	0.128
	(-2.093)	(-1.950)	(-1.928)	(-1.494)	(0.651)
Others	-0.717				
	(-1.357)				
Log(MarketCap)	5.744***	5.714***	5.718***	5.456***	2.259***
	(10.495)	(10.581)	(10.547)	(10.139)	(5.280)
Lev	0.009	0.009			
	(0.684)	(0.697)			
ROA	-0.252***	-0.250***	-0.251***	-0.236***	0.002
	(-4.965)	(-4.876)	(-4.886)	(-4.488)	(0.110)
Firm Age	0.095***	0.096***	0.096***	0.093***	1.197***
	(4.686)	(4.861)	(4.866)	(4.745)	(13.894)
Adj. Rsquared	0.273	0.271	0.271	0.289	0.214
N	4700	4700	4700	4700	4700
Fixed	Industry	Industry	Industry	Industry	Firm
				& Time	& Time

The results in *Table 5* also support *Hypothesis 1b*. Models (1) to (4) show a significantly negative relationship between institutional ownership and ESG performance. Institutional investors on average appear to be predominantly driven by financial motives and neglect sustainability considerations in their investment decisions. This argument is strengthened by the fact that our data sample primarily classified short-term institutional investors as

institutional investors.⁷ Consequently, our results are in line with the studies of Neubaum and Zahra (2006), who also indicated a negative relationship between short-term institutional investors and CSR performance.

On the basis of the results in *Table 5*, we also find support for *Hypothesis 1c*. All models indicate a significantly negative relationship between individual investors and ESG performance. The finding suggests that investments made by CSR-concerned individuals represent only a small fraction of the overall investments. Moreover, individuals in our sample are insiders in many cases, who tend to be motivated predominantly by financial motives. This finding is in line with those of Barnea and Rubin (2010) and Dam and Scholtens (2012).

The results of models (1) to (4) indicate that ownership by banks is not significantly associated with ESG performance. Based on our sample analysis, we reject our *Hypothesis 1d* - i.e., a positive relationship between bank ownership and CSR. This result contrasts with the findings of Lopatta et al. (2017), who observed a significantly positive relationship. However, our findings are in line with the results of Dam and Scholtens (2012), as they also failed to find a significant association between bank ownership and CSR.

Consistent with the expectation expressed in *Hypothesis 1e*, the results show a strong significant and negative association between corporate ownership and ESG performance in all models. Thus, corporations on average seem to neglect sustainability considerations in their investment-decision process. This result is congruent with most findings in the academic literature (see e.g., Andrade et al., 2001; Dam & Scholtens, 2012; Doukas & Petmezas, 2007).

Lastly, the estimation results do not confirm our expectations regarding the positive impact of pension fund ownership on ESG performance. Models (2) and (3) show a negative relationship at the 10% significance level. However, model (4) does not indicate a significant result. Therefore, we reject *Hypothesis If* of an anticipated positive association. The potential negative impact can be explained by the fact that pension funds might be predominantly driven by financial motives and less by CSR considerations regarding their investment decisions. In that sense, Cox and Wicks (2011) argue that pension funds are legally obliged to prioritize economic

⁷ We categorized typical long-term institutional investors such as pension funds and insurance companies to other explanatory variables. Accordingly, we use shares held by pension funds as an own explanatory variable due to the importance of pension funds on capital markets (see chapter 2.3.6 above). Shares held by insurance companies

factors whenever there is a trade-off between economic considerations and other responsibilities.

The results of model (4), in which industry as well as time fixed estimators were applied, show that the coefficients change only slightly compared to model (3), in which only industry was used as the fixed effect estimator. In addition, the significance levels do not alter considerably. This result can be explained by the fact that time specific characteristics only have a limited effect on ESG scores, since the scores do not change substantially over the years (see *Figure 3* in chapter 4.2).

ESG is a multidimensional construct composed of three different subscores, which themselves consist of several measures. Therefore, we also analyzed the respective subscores separately by applying another fixed effects regression. As we can observe in Table 6, the influence of the ownership classes on the subscores differs. In line with Strike et al. (2006), we find that if all engagement on ESG issues is aggregated to one single score, this fails to recognize whether the company might be performing well in one area, but poorly in another. For example, while the total ESG score, as well as the Social score and in particular the Environmental score, happen to be very negatively influenced by institutional ownership, the Governance score does not experience the same amount of negative influence. An explanation might be that institutional investors value improvements in corporate governance more than advancement regarding environmental or social issues. Due to lower agency costs, higher corporate governance standards are often in line with a higher shareholder value (see e.g., Bebchuck et al., 2009; Gompers et al., 2003; Shleifer & Vishny, 1997), and therefore might be valued to a larger extent by institutional investors. We can also see that the positive coefficient for size is substantially greater in model (2), in which the environmental score is used, than in model (4), in which the governance score is used. One potential explanation for these findings is that especially for improvements concerning environmental issues, a certain capacity of resources is required. Developments regarding a firm's corporate governance structure in contrast appear to be implemented without large capital requirements. Additionally, with increasing size the public attention rises (Waddock & Graves, 1997). Larger companies might therefore be particularly interested in complying to society's expectations regarding environmental concerns. However, to make more sophisticated interpretations, a thorough analysis of the components of the subscores would be necessary.

Table 6: Ownership Type and ESG Subscores

The data sample analyzed contains 4,700 observations. The table shows the outcomes of several fixed effects regressions of ownership type on ESG performance and the specific pillars. Model (1) gives the influence of the variables on the total ESG score, whereas the other models show the results for the subscores E, S, and G. For brevity, industry and time fixed effects (dummy variables) are not reported. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%), and *(10%) levels.

VARIABLES	(1)	(2)	(3)	(4)
	ESG Score	Environmental Score	Social Score	Governance Score
Corporation	-1.760***	-1.352***	-1.351**	-2.695***
Institutional	(-5.990)	(-3.697)	(-2.543)	(-4.921)
	-2.416***	-3.418***	-2.312***	-1.442**
msutuuonai	(-4.738)	(-5.283)	(-3.515)	(-2.337)
Individual	-1.712***	-1.222*	-1.729***	-2.166***
	(-3.134)	(-1.911)	(-2.691)	(-3.865)
Bank	-0.375	-0.232	-0.216	-0.664
	(-1.015)	(-0.543)	(-0.455)	(-1.399)
State	0.598*	0.627	0.479	0.693**
	(1.708)	(1.274)	(1.254)	(2.191)
Pension Fund	-0.418	-0.140	-0.235	-0.955***
	(-1.494)	(-0.300)	(-1.441)	(-2.689)
Log(MarketCap)	5.456*** (10.139)	7.226*** (9.410)	6.47*** (13.273)	2.314*** (3.008)
ROA	-0.236***	-0.325***	-0.186***	-0.199***
	(-4.488)	(-4.592)	(-3.641)	(-3.656)
Firm Age	0.093***	0.102***	0.106***	0.069***
	(4.745)	(3.840)	(5.159)	(2.811)
Adj. Rsquared	0.289	0.245	0.261	0.125
N Fixed	4700 Industry & Time	4700 Industry & Time	4700 Industry & Time	4700 Industry & Time

5.3 The Influence of Ownership Concentration (*Hypothesis 2*)

As our next step, we examined *Hypothesis* 2, concerning the impact of ownership concentration on ESG scores. So far there is no consensus among scientists about the direction of relationship. The results presented in *Table* 7 provide evidence that the negative effect outweighs the positive one and that concentration influences ESG performance negatively when only considering fixed industry (t = -9.477, p < .01) and additionally fixed time (t = -9.479, p < .01) effects (see Calza et al., 2016; Dam & Scholtens, 2013). Accordingly, we can reject the reasoning for a positive influence as argued by Chowdhry et al. (2019). The reason for the negative relationship might be that large shareholders are primarily focused on profit maximization and do not value potential benefits that come with ESG improvements. Furthermore, as argued by Dam and

Scholtens (2013), corporate social performance can be considered as a public good. Correspondingly, major shareholders are not willing to pay a relatively high price for the benefit of all others. In other words, their personal benefits do not compensate for the high costs they have to pay. Nevertheless, it must be noted that the coefficient is only slightly negative.

Except for ROA, the control variables again show the expected signs in all models. With increasing market capitalization and firm age, the ESG scores rise. Leverage again is insignificant in model (1) and appears to not have an impact on ESG scores. Consequently, it is excluded in model (2) and (3). ROA is significantly negative in all models. Although evidence exists for various relationships, we expected a positive relationship between a firm's ESG performance and financial performance. Nevertheless, our findings corroborate some previous research results on the ESG performance relationship (e.g., Aupperle et al., 1985).

Table 7: Ownership Concentration and ESG Performance

The table illustrates the outcomes of the fixed effects regression of the Herfindahl-Hirschman Index (HHI) on the total ESG score. In model (1) and (2), the industry has been fixed, whereas in model (3) the industry as well as the year were fixed. For brevity, the industry and time fixed effects (dummy variables) are not reported. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%), and *(10%) levels.

VARIABLES	Model (1) ESG Score	Model (2) ESG Score	Model (3) ESG Score
HHI	-0.005***	-0.005***	-0.005***
	(-9.486)	(-9.477)	(-9.479)
Log(MarketCap)	6.582***	6.582***	6.409***
	(13.254)	(13.234)	(13.123)
Leverage	0.008		
	(0.582)		
ROA	-0.260***	-0.261***	-0.243***
	(-5.026)	(-5.043)	(-4.571)
Firm Age	0.102***	0.102***	0.100***
	(5.196)	(5.195)	(5.079)
Adj. Rsquared	0.262	0.262	0.280
N	4700	4700	4700
Fixed	Industry	Industry	Industry & Time

To further investigate the influence of ownership concentration, an additionally comparison between dispersed and concentrated ownership has been made. The *fixed effects model* with fixed industry and ownership was applied separately on two subsamples, i.e. all companies with ownership of more than 15% as well as companies with less than 15%. The results depicted in

Table 8 provide support that the negative impact increases with concentration as it can be seen for corporations and institutional investors. The coefficient of both is substantially higher, meaning that if a corporation or an institutional investor holds shares in a company with concentrated ownership, the negative influence on the *total ESG score* increases considerably. This supports our *Hypothesis 2* stating that concentration negatively impacts the ESG score. Our previous findings indicated that state ownership has a positive influence on the ESG score. Nevertheless, in the setting of concentrated ownership this effect disappears.

Table 8: Comparison Dispersed and Concentrated Ownership

The table compares the results of our model by applying it to (1) all companies with dispersed ownership (no investor with more than 15%) and (2) concentrated ownership (at least one owner with more than 15%). For brevity, the industry and time fixed effects (dummy variables) are not reported. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%) and *(10%) levels.

VARIABLES	(1) ESG Dispersed (< 15 %)	(2) ESG Concentrated (> 15 %)
Corporation	-0.631 (-1.312)	-3.697*** (-4.061)
Institutional	-2.009*** (-3.375)	-3.254*** (-2.968)
Individual	-1.956** (-2.303)	-2.165 (-1.603)
Bank	-0.046 (-0.113)	-0.761 (-0.815)
State	0.742** (2.510)	1.358 (1.077)
Pension Fund	0.009 (0.022)	-0.886 (-1.353)
Log(MarketCap)	5.565*** (10.099)	5.125*** (5.846)
ROA	-0.238*** (-4.628)	-0.253*** (-2.733)
Firm Age	0.085*** (4.556)	0.219*** (6.595)
Adj. Rsquared	0.278 4166	0.365 534
Fixed	Industry & Time	Industry & Time

6. Robustness Check

The analysis chapter indicates significant relationships between ownership type and ESG score, as well as between ownership concentration and ESG. A comprehensive robustness check is required to assess the validity of the obtained results and was therefore conducted. First, to comply with the requirements of the Gauss-Markov theorem, the properties of the regressions were tested for violations. We test three assumptions: (1) multicollinearity, (2) homoscedasticity, and (3) serial correlation (Gujarati, 2004). Moreover, we controlled our results by using a different time lag and by using distinctive variables.

Firstly, the independent variables were tested on (1) multicollinearity. Multicollinearity is found when one regressor can be derived from a linear combination of one or more other regressors of the regression model (Gujarati, 2004). To identify potential multicollinearity, we derived a pairwise correlation matrix. The ESG score and the three subscores are highly correlated, since the ESG score is by definition computed from the three individual scores. But as they were used in separate models only, this does not influence our validity. Market capitalization seems to be highly correlated both with the scores and with institutional ownership (-0.504) (See *Table 9*). In order to verify our observations, we additionally applied the Variance Inflation Factor (VIF) test. Multicollinearity is usually given when the VIF lies above 10 (Alin, 2010). With a mean of 1.13, our results indicate that our variables are free from multicollinearity.

Table 9: Pairwise Correlation Matrix
The table illustrates the pairwise correlations of all variables used for our regression analysis.

VARIABLES	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
1 ESG_Score	1.000															
2 Env_Score	0.868	1.000														
3 Soc_Score	0.855	0.682	1.000													
4 Gov_Score	0.690	0.380	0.386	1.000												
5 Corporation	-0.098	-0.022	-0.074	-0.159	1.000											
6 Institutional	-0.335	-0.322	-0.329	-0.143	-0.095	1.000										
7 Individual	-0.228	-0.159	-0.184	-0.217	0.072	0.013	1.000									
8 Bank	0.105	0.083	0.099	0.069	-0.060	-0.204	-0.005	1.000								
9 State	0.137	0.109	0.084	0.141	-0.072	0.020	-0.083	0.077	1.000							
10 PensionFund	0.010	0.019	-0.012	0.023	-0.062	0.087	-0.038	-0.058	-0.002	1.000						
11 Others	0.186	0.173	0.180	0.075	-0.060	-0.298	-0.058	0.082	-0.014	-0.119	1.000					
12 HHI	-0.307	-0.252	-0.295	-0.194	0.263	0.602	0.320	-0.093	-0.009	-0.010	-0.130	1.000				
13 Market_Cap	0.476	0.450	0.480	0.205	-0.008	-0.504	-0.134	0.088	0.051	-0.058	0.257	-0.385	1.000			
14 Leverage	0.184	0.134	0.144	0.184	-0.037	-0.105	-0.189	0.064	0.031	0.031	0.065	-0.115	0.099	1.000		
15 ROA	-0.026	-0.017	0.026	-0.089	-0.003	-0.122	0.131	0.048	-0.030	-0.037	0.038	-0.077	0.142	-0.402	1.000	
16 Age	0.248	0.205	0.237	0.150	-0.121	-0.216	-0.014	0.169	0.065	-0.042	0.169	-0.174	0.140	0.077	0.082	1.000

- (2) Homoscedasticity is given if the errors in the estimated model exhibit constant variance. In contrast, heteroscedasticity persists if the errors do not show constant levels of variance. To test for heteroscedasticity, we have applied the Breusch-Pagan test, which checks the null-hypothesis of homoscedasticity (Wooldridge, 2012). In our case, the test showed p-values below 5%, implying the presence of heteroscedasticity. Consequently, we adapted our models with robust standard errors to make it valid in the presence of heteroscedasticity.
- (3) Serial correlation or autocorrelation persist if the error terms of the regression ordered in time exhibit correlation (Gujarati, 2004). To test our regression for serial correlation, we conducted the Breusch-Godfrey test (Wooldridge, 2012). The results indicate that we can reject the null-hypothesis of serial correlation within the idiosyncratic errors and thus meet the requirements of the Gauss-Markov theorem. For an overview of the test outcomes, please see Appendix, *Table B*.

It can be argued that a time period of one year is not sufficient for an investor to achieve large changes to the ESG practices of its investment company. Therefore, we conducted a robustness check of our results by including a time lag of three years instead. As it can be seen in *Table 10*, the results reveal the same relationships signs and significance levels as our one-year values, thereby lending further support to our obtained results.

Table 10: Controlling for Time Lag

The table illustrates the outcomes of a fixed effects regression with fixed industry and time effects. In particular, it shows a comparison between (1) a one-year time lag and (2) a three-year time lag. For brevity, the industry and time (dummy) variables are not reported. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%), and *(10%) levels.

WADIADIEC	(1) ESG Score	(2) ESG Score
VARIABLES	1 Year	3 Years
Corporation	-1.760***	-1.390***
	(-5.990)	(-5.026)
Institutional	-2.416***	-2.266***
	(-4.738)	(-3.782)
Individual	-1.712***	-1.620***
	(-3.134)	(-2.716)
Bank	-0.375	-0.373
	(-1.015)	(-0.908)
State	0.598*	0.725**
	(1.708)	(2.392)
Pension Fund	-0.418	-0.56**
	(-1.494)	(-2.215)
Log(MarketCap)	5.456***	5.915***
•	(10.139)	(10.979)
ROA	-0.236***	-0.228***
	(-4.488)	(-4.678)
Firm Age	0.093***	0.081***
C	(4.745)	(4.438)
Adi Deguared	0.289	0.310
Adj. Rsquared		
N E:	4700	3633
Fixed	Industry & Time	Industry & Time

Concerning the model for concentration, we performed a further regression based on all observations of the ownership data disregarding an investor's specific type. Thus, we do not aggregate the shares held by each investor to the specific investor class but use dummy variables instead. The dummy variable equals 1 if an investor exceeds a particular percentage of shares held in a firm; otherwise it is 0. Once again, we use a *fixed effect model* with industry and time fixed effects. Therefore, the regression equation is as follows:

(4) Total ESG Score
$$_{it} = \beta_1 ConcentrationDummy_{it-1} + \beta_2 log(MarketCap)_{it} + \beta_4 ROA_{it} + \beta_5 FirmAge_{it} + \alpha_i + v_{it}$$

where *total ESG score* is the firm-specific assessment regarding sustainability performance. *ConcentrationDummy* represents the independent variable. *MarketCap*, *ROA*, and *FirmAge*

serve as the control variables; α_i represents the fixed effect estimator and v_{it} reflects the error term. Model (1) accounts for shareholders holding more than 25% of shares in a specific company. Models (2) and (3) account for holdings of more than 15% and 10%, respectively.

The results depicted in *Table 11* support our expectations of *Hypothesis 2*, as the signs of the dummy coefficients for concentration are negative. In addition, the results suggest that the effect becomes more powerful with increasing concentration. It must be noted that all dummy coefficients are significant at the 1% level.

Table 11: Controlling for Concentration

The table illustrates the outcomes of the fixed effects regression of the dummy variables for concentration on the total ESG score. In model (1) the dummy accounts for shareholders holding more than 25%, whereas models (2) and (3) further include 15% and 10% shareholdings. The robust t values for all variables obtained through the sandwich estimator are reported in parenthesis. The significance level is denoted by asterisks at the ***(1%), **(5%), and *(10%) levels.

VARIABLES	(1) ESG Score	(2) ESG Score	(3) ESG Score
Description Variable 250/	C 024***		
Dummy Variable 25%	-6.024*** (-4.333)		
Dummy Variable 15%		-2.678***	
		(-3.513)	
Dummy Variable 10%			-1.807***
•			(-3.071)
Log(MarketCap)	6.379***	6.377***	6.372***
	(12.815)	(12.816)	(12.801)
ROA	-0.245***	-0.245***	-0.245***
	(-4.514)	(-4.514)	(-4.519)
Firm Age	0.110***	0.110***	0.110***
C	(5.872)	(5.875)	(5.873)
Adj. Rsquared	0.265	0.265	0.265
N	145553	145553	145553
Fixed	Industry	Industry	Industry
	& Time	& Time	& Time

7. Caveats

To begin with, our study design has led to a relatively high number of observations. Nevertheless, these vary for the respective investor classes. While we obtained a huge amount of observations for institutional investors, those for individual ones are much lower. Accordingly, for some classes a generalization of results must be considered carefully. However, this only reflects the nature of the equity market, in which institutional investors play a major role.

Furthermore, an extensive body of literature addresses the causality of the relationship between ownership and ESG. It can be argued that investors do not influence ESG positively, but that the level of the ESG score is the reason for an investment/disinvestment. As found for the relation between ESG and financial performance by Waddock and Graves (1997), a virtuous cycle might also exist where ownership appears to be both a predictor and a consequence of ESG performance.

It is also important to note that the findings are highly dependent on the ESG measurement method used. Halbritter and Dorfleitner (2015) provide proof that the rating concept used as well as the time interval of the obtained information influence which effects can be reported. Berg et al. (2019) show that when comparing five different sustainability ratings (namely, *KLD*, *Sustainaliytics*, *Vigeo-Eiris*, *Asset4*, and *RobecoSam*) the correlation between the ratings is 0.61 on average. To put this into context, the correlation between credit ratings of Standard & Poor's and Moody's is 0.99. We are mitigating this problem by obtaining all data from the same data source. Nevertheless, when trying to replicate our findings with other sustainability data sources instead, problems might occur due to these differences and potentially lead to differing results.

Lastly, it also needs to be questioned how much change ownership can actually achieve. The extent to which an improvement of ESG is manageable is also dependent on the industry in which the company is operating. If a company is engaging in highly polluting industries, for example, the impact achievable through ownership engagement will be limited. The industry comparison depicted in *Table 12* supports this assumption. As can be seen, the means range from 41.80 for investment holding companies to 76.28 for industrial conglomerates, which indicates the differences of ESG score levels in the various industries.

Table 12: Descriptive Statistics Company Industries

The table below provides descriptive statistics about the total ESG scores in the industries the companies of our final sample are operating in.

INDUSTRIES	Mean ESG	Min ESG	Max ESG	StdDev ESG	N
Applied Resources	57.739	35.707	82.899	13.532	61
Automobiles & Auto Parts	51.296	20.619	83.327	17.245	85
Banking & Investment Services	59.535	22.915	88.909	16.925	376
Chemicals	63.158	21.750	84.451	12.796	123
Collective Investments	65.597	39.470	79.433	13.556	9
Cyclical Consumer Products	54.603	24.496	86.771	15.971	168
Cyclical Consumer Services	55.612	18.311	92.079	16.899	264
Energy - Fossil Fuels	60.166	17.475	92.487	16.036	375
Food & Beverages	67.774	36.567	92.454	12.131	202
Food & Drug Retailing	68.603	36.778	87.149	9.945	61
Healthcare Services & Equipment	59.120	20.044	93.265	17.320	328
Industrial & Commercial Services	50.983	21.882	87.878	18.086	177
Industrial Conglomerates	76.276	41.096	92.160	14.535	42
Industrial Goods	58.256	8.600	91.435	18.009	301
Insurance	57.970	23.527	90.292	15.667	195
Investment Holding Companies	41.798	31.042	49.538	6.646	9
Mineral Resources	62.100	34.487	88.715	14.645	70
Personal & Household Products &	56.398	22.500	85.312	19.239	87
Pharmaceuticals & Medical Resear	66.416	32.119	90.622	15.243	138
Real Estate	60.966	16.664	91.426	15.649	260
Renewable Energy	56.331	45.438	69.055	8.115	13
Retailers	62.252	24.149	91.008	15.951	302
Software & IT Services	62.749	18.462	94.485	18.016	299
Technology Equipment	61.767	19.292	97.898	17.774	325
Telecommunications Services	62.583	30.654	84.829	15.603	47
Transportation	62.801	20.914	81.591	13.596	112
Utilities	64.831	29.460	87.228	12.136	271
Total sample	60.412	8.600	97.898	16.622	4700

8. Conclusion and Future Research

In this paper, we investigated the relationship between ownership structure and ESG performance. More specifically, we examined the impact of institutional investors, banks, states, corporations, individuals, and pension funds on a firm's sustainability performance, as measured by the *total ESG score* and the specific subscores for environmental (E), social (S), and governance (G) categories. Investors differ significantly concerning their commitment to CSR measures, since each investor has his or her own view about the issue and holds a different role and position in society. For example, a state is obliged to act on behalf of its citizens' interests and must consider moral and ethical aspects in a different way than institutional investors do. Accordingly, institutional investors might be predominantly driven by profit maximization while disregarding other factors such as social responsibility. Moreover, we investigated the effect of shareholder concentration on ESG performance. The interests of large shareholders might differ from those of minority shareholders in the context of CSR, and a large shareholder presumably has a stronger influence on a company's strategic decision than small diversified shareholders.

The sample analyzed comprises data on the top 30 shareholders of each company that was part of the *S&P 500* between January 2010 and December 2018. The shares held by each investor in a respective firm were aggregated and classified to the specific ownership classes, which we ultimately investigated.

The results suggest that ownership structure has an impact on ESG in such a way that different investor types influence a company's sustainability performance in distinctive ways. More specifically, company ownership by a state is positively related to a company's engagement towards CSR. Firm ownership by institutional investors, corporations, and individuals indicates a negative association with respect to a firm's ESG performance. It appears that these investor types prioritize financial motivations over corporate social responsibility considerations. Furthermore, ownership by banks and pension funds seems to exhibit a neutral influence on their respective ESG scores. In this regard, our first perception of a differential CSR awareness by each shareholder type was confirmed.

The results can be explained by the following reasoning. Institutional investors seem to be driven predominantly by financial returns because they act on behalf of their own investors, which tend to be primarily profit orientated. Corporations are mainly motivated by strategic

considerations, such as promising mergers and acquisitions activities with respect to shareholdings in other companies. Accordingly, sustainability aspects appear to represent only a subordinate concern in their investment decision-making. Individuals are often hampered by information disadvantages, and the fraction of CSR-concerned individuals still represents only a small number of the overall investments. States seem to exert their moral and ethical mandate through their portfolio investments and also encourage companies towards developments in CSR. The neutral influence of banks and pension funds regarding ESG performance can be explained by the fact that these investors assess the costs and benefits of CSR, which seem to outweigh each other. While pension funds might value the positive long-term effects of CSR, they seem to be driven by short-term financial motives at the same time.

Moreover, we find a significant negative relationship between shareholder concentration and ESG performance in a way that with increasing concentration, the negative impact becomes stronger. We follow the argumentation of Dam and Scholtens (2013) stating that corporate social performance can be regarded as a public good. As a consequence, large shareholders are not willing to pay a relatively high price to the benefit of all others.

To ensure the reliability of the empirical results, we performed several robustness checks, including tests that account for multicollinearity, homoscedasticity, and serial correlation. Furthermore, we used a divergent set of explanatory variables to confirm our findings.

This paper adds value to the existing research in the field of organizations and corporate social responsibility. Yet many open questions remain that warrant future research. Future researchers could investigate the specific investment motives of different ownership types more deeply, particularly with regard to ESG considerations in their decision-making process. Moreover, our analysis spanned nine years. It would be interesting to carry out a similar study addressing a longer period to strengthen the results. However, the ESG topic is relatively new, and comprehensive data are limited in terms of availability. We are also aware of the potential endogeneity issue, in the sense that it is not clear whether certain types of shareholders impact a firm's ESG performance or whether specific firms attract certain types of shareholders. Hence, we do not draw any conclusion regarding the direction of causality. Other approaches may help to study the causality between ownership structure and ESG performance, which could be investigated in future research.

The implications of our results may be of interest for policy makers, as CSR has recently become a key topic on the public agenda. In this sense, governments aim to steer companies towards more sustainability. Correspondingly, our findings suggest that it could be decisive for policy makers not only to act on the company level, but also to stimulate the respective owners towards a higher awareness of CSR.

In accordance with the statement cited in the beginning of this paper, an increasing number of investors concerned with sustainability will highlight the importance of ESG for society as a whole. In this sense, companies are already in a period of tremendous change, but "we are only at the early stages."

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Appendix

Table A: Grading Score Range

The table shows the score ranges and the respective ESG grades in Thomson Reuters Refinitiv. The table is based on Refinitiv 2019.

Score Range	Grade
$0.0 \le \text{score} \le 0.083333$	D -
$0.083333 < \text{score} \le 0.166666$	D
$0.166666 < score \le 0.250000$	D +
$0.250000 < score \le 0.333333$	C -
$0.333333 < score \le 0.416666$	C
$0.416666 < score \le 0.500000$	C +
$0.500000 < score \le 0.583333$	В -
$0.583333 < score \le 0.666666$	В
$0.666666 < score \le 0.750000$	B +
$0.750000 < score \le 0.833333$	A -
$0.833333 < score \le 0.916666$	A
$0.916666 < score \le 1$	A +

Table B: Overview of Statistical Tests conducted

The table below summarizes the statistical tests conducted. It provides the rationale behind choosing the tests, the null hypothesis as well as the results we obtained. All tests have been applied to all models to provide a thorough robustness check.

Conducted Test	Rationale	Null Hypothesis	Result
Breusch-Godfrey Test	Tests for serial/ autocorrelation	H ₀ : no serial correlation in ideosyncratic errors	No serial correlation in our model
Breusch-Pagan Test	Tests for heteroscedasticity	H ₀ : constant variance	Significant heteroscedasticity for our models
Variance Inflation Factor (VIF) Test	Tests for multicollinearity	Test gives out VIFs. VIF > 10 indicates multicollinearity	Mean of 1.13 indicates that variables are free of multicollinearity

Table C: Overview of Sample Companies

The table below illustrates the sample companies as well as their respective industry and the mean ESG score over the sample period.

Company Name	Industry	Mean ESG	Company Name	Industry	Mean ESG
3M Co	Industrial Conglomerates	87.06	Amgen Inc	Pharma & Medical Research	66.07
A. O. Smith Corp	Industrial Goods	41.13	Amphenol Corp	Technology Equipment	38.75
Abbott Laboratories	Healthcare Services & Equipment	80.50	Anadarko Petroleum Corp	Energy - Fossil Fuels	61.40
Abbvie Inc	Pharma & Medical Research	73.57	Analog Devices Inc	Technology Equipment	77.07
Abercrombie & Fitch Co	Retailers	49.51	Andeavor	Energy - Fossil Fuels	73.34
Abiomed Inc	Healthcare Services & Equipment	45.67	ANSYS Inc	Software & IT Services	50.82
Accenture PLC	Software & IT Services	87.27	Anthem Inc	Healthcare Services & Equipment	77.91
Activision Blizzard Inc	Software & IT Services	46.04	Aon PLC	Insurance	61.21
Acuity Brands Inc	Cyclical Consumer Products	49.24	Apache Corp	Energy - Fossil Fuels	59.94
Adient PLC	Automobiles & Auto Parts	46.34	Apartment Investment and Management	Real Estate	56.83
Adobe Inc	Software & IT Services	79.58	Apergy Corp	Energy - Fossil Fuels	49.15
ADT Security Corp	Technology Equipment	49.31	Apollo Education Group Inc	$Personal\ \&\ Household\ Prod.\ \&\ Serv.$	35.19
Adtalem Global Education Inc	$Personal\ \&\ Household\ Prod.\ \&\ Serv.$	29.80	Apple Inc	Technology Equipment	72.16
Advance Auto Parts Inc	Retailers	48.19	Applied Materials Inc	Technology Equipment	75.88
Advanced Micro Devices Inc	Technology Equipment	77.68	Aptiv PLC	Automobiles & Auto Parts	45.18
AdvanSix Inc	Chemicals	45.70	Archer Daniels Midland Co	Food & Beverages	67.44
AES Corp	Utilities	55.04	Arconic Inc	Mineral Resources	78.57
Aetna Inc	Healthcare Services & Equipment	74.00	Arista Networks Inc	Technology Equipment	49.67
Affiliated Computer Services Inc	Software & IT Services	N/A	Arthur J Gallagher & Co	Insurance	52.59
Affiliated Managers Group Inc	Banking & Investment Services	34.92	Assurant Inc	Insurance	54.00
Aflac Inc	Insurance	70.18	AT&T Inc	Telecommunications Services	72.98
Agilent Technologies Inc	Healthcare Services & Equipment	85.57	Atmos Energy Corp	Utilities	35.09
Air Products and Chemicals Inc	Chemicals	79.55	Autodesk Inc	Software & IT Services	83.93
Airgas Inc	Chemicals	39.65	Automatic Data Processing Inc	Software & IT Services	67.21
AK Steel Holding Corp	Mineral Resources	70.47	AutoNation Inc	Retailers	47.27
Akamai Technologies Inc	Software & IT Services	57.17	Autozone Inc	Retailers	57.90
Alaska Air Group Inc	Transportation	62.71	AvalonBay Communities Inc	Real Estate	70.05
Albemarle Corp	Chemicals	63.49	Avery Dennison Corp	Applied Resources	74.72
Alcoa Corp	Mineral Resources	87.62	Avon Products Inc	Personal & Household Prod. & Serv.	72.17
Alexandria Real Estate Equities Inc	Real Estate	50.54	Baker Hughes Co	Energy - Fossil Fuels	74.19
Alexion Pharmaceuticals Inc	Pharma & Medical Research	47.72	Ball Corp	Applied Resources	66.09
Align Technology Inc	Healthcare Services & Equipment	32.55	Bank of America Corp	Banking & Investment Services	76.53
Allegheny Energy Inc	Utilities	N/A	Bank of New York Mellon Corp	Banking & Investment Services	78.16
Allegheny Technologies Inc	Industrial Goods	45.01	Baxalta Inc	Pharma & Medical Research	29.90
Allegion PLC	Technology Equipment	41.83	Baxter International Inc	Healthcare Services & Equipment	75.59
Allergan Inc	Pharma & Medical Research	74.26	BB&T Corp	Banking & Investment Services	40.61
Allergan plc	Pharma & Medical Research	44.03	Beam Suntory Inc	Food & Beverages	43.55
Alliance Data Systems Corp	Industrial & Commercial Services	59.87	Becton Dickinson and Co	Healthcare Services & Equipment	78.59
Alliant Energy Corp	Utilities	55.72	Bed Bath & Beyond Inc	Retailers	63.20
Allstate Corp	Insurance	86.44	Bemis Company Inc	Applied Resources	42.85
Alpha Appalachia Holdings LLC	Energy - Fossil Fuels	N/A	Berkshire Hathaway Inc	Insurance	34.19
Alpha Natural Resources Inc	Energy - Fossil Fuels	49.60	Best Buy Co Inc	Retailers	74.00
Alphabet Inc	Software & IT Services	68.01	Big Lots Inc	Retailers	57.82
Altaba Inc	Collective Investments	65.60	Biogen Inc	Pharma & Medical Research	75.28
Altera Corp	Technology Equipment	62.48	Bioverativ Inc	Pharma & Medical Research	N/A
Altria Group Inc	Food & Beverages	74.73	BJ Services Company LLC	Energy - Fossil Fuels	N/A
Amazon.com Inc	Retailers	64.56	Black & Decker Corp	Cyclical Consumer Products	N/A
Amcor PLC	Applied Resources	73.19	BlackRock Inc	Banking & Investment Services	51.38
Ameren Corp	Utilities	53.61	Bmc Software Inc	Software & IT Services	60.24
American Airlines Group Inc	Transportation	70.67	Boeing Co	Industrial Goods	86.24
American Electric Power Company Inc		72.84	Booking Holdings Inc	Cyclical Consumer Services	28.24
American Express Co	Banking & Investment Services	73.74	BorgWarner Inc	Automobiles & Auto Parts	50.48
American International Group Inc	Insurance	56.71	Boston Properties Inc	Real Estate	59.95
American Tower Corp	Real Estate	65.01	Boston Scientific Corp	Healthcare Services & Equipment	63.74
American Vater Works Company Inc	Utilities	74.16	Brighthouse Financial Inc	Insurance	26.11
Ameriprise Financial Inc	Banking & Investment Services	60.63	Bristol-Myers Squibb Co	Pharma & Medical Research	79.55
	Dunking & myestilicht Scrvices	00.03	Diracor-my dia aquito Co	i italina & Medicai Resealeli	17.33
AmerisourceBergen Corp	Healthcare Services & Equipment	53.67	Broadcom Corp	Technology Equipment	68.51

Broadridge Financial Solutions Inc	Industrial & Commercial Services	42.97	Copart Inc	Retailers	31.81
Brookfield Property Reit Inc	Real Estate	56.09	Corning Inc	Technology Equipment	68.66
Brown-Forman Corp	Food & Beverages	58.17	Corteva Inc	Food & Beverages	N/A
Burlington Northern Santa FE Corp	Transportation	N/A	Costco Wholesale Corp	Retailers	66.06
C R Bard Inc	Healthcare Services & Equipment	52.29	Coty Inc	Personal & Household Prod. & Serv.	39.67
C.H. Robinson Worldwide Inc	Transportation	36.35	Coventry Health Care Inc	Healthcare Services & Equipment	45.84
CA Inc	Software & IT Services	75.55	Covetrus Inc	Healthcare Services & Equipment	N/A
Cablevision Systems Corp	Cyclical Consumer Services	23.55	Covidien PLC	Healthcare Services & Equipment	59.48
Cabot Oil & Gas Corp	Energy - Fossil Fuels	41.67	Crown Castle International Corp	Real Estate	36.23
Cadence Design Systems Inc	Software & IT Services	40.96	CSRA Inc	Software & IT Services	46.92
Cameron International Corp	Energy - Fossil Fuels	66.18	CSX Corp	Transportation	72.97
Campbell Soup Co	Food & Beverages Banking & Investment Services	79.88 69.68	Cummins Inc	Automobiles & Auto Parts	77.13 88.13
Capital One Financial Corp Capri Holdings Ltd	Retailers	46.32	CVS Health Corp D.R. Horton Inc	Healthcare Services & Equipment Cyclical Consumer Products	44.49
Cardinal Health Inc	Food & Drug Retailing	57.18	Danaher Corp	Healthcare Services & Equipment	55.14
Carefusion Corp	Healthcare Services & Equipment	46.77	Darden Restaurants Inc	Cyclical Consumer Services	59.03
Carmax Inc	Retailers	52.06	DaVita Inc	Healthcare Services & Equipment	66.12
Carnival Corp	Cyclical Consumer Services	71.63	Dean Foods Co	Food & Beverages	63.89
Cars.com Inc	Software & IT Services	49.84	Deere & Co	Industrial Goods	71.77
Caterpillar Inc	Industrial Goods	79.58	Dell Inc	Technology Equipment	68.09
Cboe Global Markets Inc	Banking & Investment Services	42.44	Dell Technologies Inc	Technology Equipment	42.26
CBRE Group Inc	Real Estate	85.76	Delphi Technologies PLC	Automobiles & Auto Parts	43.72
CBS Corp	Cyclical Consumer Services	59.56	Delta Air Lines Inc	Transportation	68.33
CDW Corp	Software & IT Services	63.25	Denbury Resources Inc	Energy - Fossil Fuels	67.62
Celanese Corp	Chemicals	57.05	Dentsply Sirona Inc	Healthcare Services & Equipment	44.65
Celgene Corp	Pharma & Medical Research	60.79	Devon Energy Corp	Energy - Fossil Fuels	59.80
Centene Corp	Healthcare Services & Equipment	49.90	Diamond Offshore Drilling Inc	Energy - Fossil Fuels	41.11
CenterPoint Energy Inc	Utilities	44.27	Diamondback Energy Inc	Energy - Fossil Fuels	36.64
Centurylink Inc	Telecommunications Services	64.35	Digital Realty Trust Inc	Real Estate	53.55
Cephalon Inc	Applied Resources	66.63	DIRECTV	Cyclical Consumer Services	66.49
Cerner Corp	Healthcare Services & Equipment	41.64	Discover Financial Services	Banking & Investment Services	63.92
CF Industries Holdings Inc	Chemicals	41.09	Discovery Inc	Cyclical Consumer Services	51.08
Charles Schwab Corp	Banking & Investment Services	50.42 33.75	DISH Network Corp	Cyclical Consumer Services	25.36 41.18
Charter Communications Inc	Cyclical Consumer Services	59.84	Dollar General Corp Dollar Tree Inc	Retailers Retailers	47.71
Chesapeake Energy Corp	Energy - Fossil Fuels	86.31		Utilities	69.86
Chevron Corp Chipotle Mexican Grill Inc	Energy - Fossil Fuels Cyclical Consumer Services	45.36	Dominion Energy Inc Dominion Energy Questar Corp	Utilities	70.28
Chubb Corp	Insurance	64.65	Dow Chemical Co	Chemicals	78.87
Chubb Ltd	Insurance	62.00	Dow Inc	Chemicals	N/A
Church & Dwight Co Inc	Personal & Household Prod. & Serv.	58.50	Dover Corp	Industrial Goods	57.24
Cigna Corp	Healthcare Services & Equipment	72.63	DTE Energy Co	Utilities	69.60
Cimarex Energy Co	Energy - Fossil Fuels	31.48	Duke Energy Corp	Utilities	71.15
Cincinnati Financial Corp	Insurance	47.41	Duke Realty Corp	Real Estate	56.07
Cintas Corp	Industrial & Commercial Services	70.60	Dun & Bradstreet Corp	Industrial & Commercial Services	53.43
Cisco Systems Inc	Technology Equipment	88.00	Dupont De Nemours Inc	Chemicals	N/A
Citigroup Inc	Banking & Investment Services	81.87	DXC Technology Co	Software & IT Services	64.74
Citizens Financial Group Inc	Banking & Investment Services	52.97	EI du Pont de Nemours and Co	Industrial Conglomerates	84.10
Citrix Systems Inc	Software & IT Services	60.64	E*TRADE Financial Corp	Banking & Investment Services	34.26
Cleveland-Cliffs Inc	Mineral Resources	70.65	Eastman Chemical Co	Chemicals	67.87
Clorox Co	Personal & Household Prod. & Serv.	81.30	Eastman Kodak Co	Technology Equipment	55.86
CME Group Inc	Banking & Investment Services	52.07	Eaton Corporation PLC	Industrial Goods	73.82
CMS Energy Corp	Utilities	58.47	eBay Inc	Software & IT Services	64.64
CNX Resources Corp	Energy - Fossil Fuels	60.27	Ecolab Inc	Chemicals	72.58
Coca-Cola Co	Food & Beverages	76.60	Edison International	Utilities	51.03
Coca-Cola European Partners PLC	Food & Beverages	68.83	Edwards Lifesciences Corp	Healthcare Services & Equipment	57.60 71.17
Colored Polyneline Co	•	69.31 82.45	El Paso LLC	Energy - Fossil Fuels	57.99
Colgate-Palmolive Co Columbia Pipeline Group Inc	Personal & Household Prod. & Serv. Energy - Fossil Fuels	27.82	Electronic Arts Inc Eli Lilly and Co	Software & IT Services Pharma & Medical Research	78.24
Comcast Corp	Cyclical Consumer Services	62.61	EMC Corp	Technology Equipment	70.59
Comerica Inc	Banking & Investment Services	74.93	EMD Millipore Corp	Pharma & Medical Research	N/A
Compuware Corp	Software & IT Services	54.71	Emerson Electric Co	Industrial Goods	59.41
Conagra Brands Inc	Food & Beverages	76.04	Endo International PLC	Pharma & Medical Research	37.80
Concho Resources Inc	Energy - Fossil Fuels	36.93	Entergy Corp	Utilities	74.51
Conduent Inc	Software & IT Services	61.91	Envision Healthcare Corp	Healthcare Services & Equipment	38.55
ConocoPhillips	Energy - Fossil Fuels	85.97	Envision Healthcare Holdings Inc	Healthcare Services & Equipment	37.56
Consolidated Edison Inc	Utilities	77.12	EOG Resources Inc	Energy - Fossil Fuels	57.05
Constellation Brands Inc	Food & Beverages	46.50	EQT Corp	Energy - Fossil Fuels	58.83
Constellation Energy Group Inc	Utilities	82.94	Equifax Inc	Industrial & Commercial Services	41.14
Cooper Companies Inc	Healthcare Services & Equipment	36.17	Equinix Inc	Real Estate	60.72
Cooper Industries Unlimited Co	Industrial Goods	60.73	Equity Residential	Real Estate	61.54

Essex Property Trust Inc	Real Estate	40.34	HCP Inc	Real Estate	74.03
Estee Lauder Companies Inc	Personal & Household Prod. & Serv.	68.22	Helmerich and Payne Inc	Energy - Fossil Fuels	27.57
Everest Re Group Ltd	Insurance	40.13	Henry Schein Inc	Healthcare Services & Equipment	57.37
Evergy Inc	Utilities	35.14	Hershey Co	Food & Beverages	73.10
Eversource Energy	Utilities	68.20	Hess Corp	Energy - Fossil Fuels	71.74
Exelon Corp	Utilities	73.50	Hewlett Packard Enterprise Co	Technology Equipment	77.53
Expedia Group Inc	Cyclical Consumer Services	25.74	Hillshire Brands Co	Food & Beverages	77.95
Expeditors International of Washingt	-	53.46	Hilton Worldwide Holdings Inc	Cyclical Consumer Services	69.25
Express Scripts Holding Co	Food & Drug Retailing	44.21	HollyFrontier Corp	Energy - Fossil Fuels	45.56
Extra Space Storage Inc	Real Estate	21.40	Hologic Inc	Healthcare Services & Equipment	48.09
Exxon Mobil Corp	Energy - Fossil Fuels	81.17	Home Depot Inc	Retailers	81.03
F5 Networks Inc Facebook Inc	Software & IT Services Software & IT Services	52.66 50.04	Honeywell International Inc	Industrial Conglomerates Food & Beverages	72.22 64.08
Family Dollar Stores Inc	Retailers	57.69	Hormel Foods Corp	Pharma & Medical Research	69.66
Fastenal Co	Industrial Goods	33.33	Hospira Inc Host Hotels & Resorts Inc	Real Estate	73.74
Federal Realty Investment Trust	Real Estate	57.12	HP Inc	Technology Equipment	79.97
Federated Investors Inc	Banking & Investment Services	27.39	Hudson City Bancorp Inc	Banking & Investment Services	26.63
FedEx Corp	Transportation	77.17	Humana Inc	Healthcare Services & Equipment	75.60
Fidelity National Information Service	-	39.23	Huntington Bancshares Inc	Banking & Investment Services	53.34
Fifth Third Bancorp	Banking & Investment Services	65.14	Huntington Ingalls Industries Inc	Industrial Goods	39.93
First Horizon National Corp	Banking & Investment Services	54.11	IDEX Corp	Industrial Goods	45.55
First Republic Bank	Banking & Investment Services	45.72	IDEXX Laboratories Inc	Healthcare Services & Equipment	30.98
First Solar Inc	Renewable Energy	54.55	IHS Markit Ltd	Industrial & Commercial Services	55.67
FirstEnergy Corp	Utilities	58.81	ILGLic	Cyclical Consumer Services	26.27
Fiserv Inc	Industrial & Commercial Services	31.10	Illinois Tool Works Inc	Industrial Conglomerates	52.29
Fleetcor Technologies Inc	Industrial & Commercial Services	27.65	Illumina Inc	Healthcare Services & Equipment	39.88
FLIR Systems Inc	Technology Equipment	30.32	Incyte Corp	Pharma & Medical Research	60.96
Flowserve Corp	Industrial Goods	63.19	Ingersoll-Rand PLC	Industrial Goods	70.00
Fluor Corp	Industrial & Commercial Services	75.08	Ingevity Corp	Chemicals	32.47
FMC Corp	Chemicals	59.43	Intel Corp	Technology Equipment	92.26
FMC Technologies Inc	Energy - Fossil Fuels	40.35	Intercontinental Exchange Inc	Banking & Investment Services	48.90
Foot Locker Inc	Retailers	37.79 69.00	International Business Machines Corp	Software & IT Services	85.38 73.88
Ford Motor Co Forest Laboratories Inc	Automobiles & Auto Parts Pharma & Medical Research	35.70	International Flavors & Fragrances Inc	Food & Beverages Cyclical Consumer Services	N/A
Fortinet Inc	Software & IT Services	47.70	International Game Technology International Paper Co	Applied Resources	72.56
Fortive Corp	Industrial Goods	31.67	Interpublic Group of Companies Inc	Cyclical Consumer Services	69.07
Fortune Brands Home & Security Inc		45.60	Intuit Inc	Software & IT Services	83.28
Fossil Group Inc	Cyclical Consumer Products	32.63	Intuitive Surgical Inc	Healthcare Services & Equipment	47.52
Four Corners Property Trust Inc	Real Estate	38.88	Invesco Ltd	Banking & Investment Services	64.87
Fox Corp	Cyclical Consumer Services	N/A	IPG Photonics Corp	Technology Equipment	32.36
Franklin Resources Inc	Banking & Investment Services	64.91	IQVIA Holdings Inc	Pharma & Medical Research	64.00
Freeport-McMoRan Inc	Mineral Resources	74.12	Iqvia Inc	Pharma & Medical Research	N/A
Frontier Communications Corp	Telecommunications Services	55.63	Iron Mountain Inc	Real Estate	58.30
GameStop Corp	Retailers	47.30	ITT Inc	Industrial Goods	68.30
Gap Inc	Retailers	89.04	J B Hunt Transport Services Inc	Transportation	50.67
Garmin Ltd	Industrial Goods	53.96	J C Penney Company Inc	Retailers	73.25
Garrett Motion Inc	Automobiles & Auto Parts	45.60	J M Smucker Co	Food & Beverages	55.65
Gartner Inc	Software & IT Services	45.54	Jabil Inc	Technology Equipment	60.91
General Dynamics Corp	Industrial Goods	66.60	Jack Henry & Associates Inc	Software & IT Services	31.77
General Electric Co	Industrial Conglomerates	88.84	Jacobs Engineering Group Inc	Industrial & Commercial Services	61.09
General Mills Inc	Food & Beverages	81.52	Janus Capital Group Inc	Banking & Investment Services	53.58
General Motors Co	Automobiles & Auto Parts	63.49 30.62	JBG SMITH Properties	Real Estate	64.70 41.80
Genuine Parts Co	Automobiles & Auto Parts	51.18	Jefferies Financial Group Inc Johnson & Johnson	Investment Holding Companies Pharma & Medical Research	87.27
Genworth Financial Inc Genzyme Corp	Insurance Pharma & Medical Research	N/A	Johnson Controls Inc	Automobiles & Auto Parts	N/A
Gilead Sciences Inc	Pharma & Medical Research	73.44	Johnson Controls International PLC	Industrial Goods	85.67
Global Payments Inc	Industrial & Commercial Services	26.74	JPMorgan Chase & Co	Banking & Investment Services	80.91
Globe Life Inc	Insurance	36.01	Juniper Networks Inc	Technology Equipment	67.66
Goldman Sachs Group Inc	Banking & Investment Services	70.51	Kansas City Southern	Transportation	51.23
Goodrich Corp	Industrial Goods	56.81	Kellogg Co	Food & Beverages	67.12
Goodyear Tire & Rubber Co	Automobiles & Auto Parts	55.59	Keurig Dr Pepper Inc	Food & Beverages	66.51
Graham Holdings Co	Personal & Household Prod. & Serv.	37.50	Keurig Green Mountain Inc	Food & Beverages	72.82
H & R Block Inc	Personal & Household Prod. & Serv.	42.40	KeyCorp	Banking & Investment Services	74.58
Halliburton Co	Energy - Fossil Fuels	79.36	Keysight Technologies Inc	Industrial Goods	74.09
HanesBrands Inc	Cyclical Consumer Products	66.57	Kimberly-Clark Corp	Personal & Household Prod. & Serv.	67.54
Harley-Davidson Inc	Automobiles & Auto Parts	45.57	Kimco Realty Corp	Real Estate	68.01
Harman International Industries Inc	Automobiles & Auto Parts	48.33	Kinder Morgan Inc	Energy - Fossil Fuels	37.16
Hartford Financial Services Group Inc	Insurance	76.41	King Pharmaceuticals LLC	Pharma & Medical Research	N/A
Hasbro Inc	Cyclical Consumer Products	79.88	KLA Corp	Technology Equipment	54.62
HCA Healthcare Inc	Healthcare Services & Equipment	49.83	Kohls Corp	Retailers	77.28

Komatsu Mining Corp	Mineral Resources	49.97	Morgan Stanley	Banking & Investment Services	76.97
Kontoor Brands Inc	Cyclical Consumer Products	N/A	Mosaic Co	Chemicals	63.85
Kraft Foods Group Inc	Food & Beverages	39.64	Motorola Mobility Holdings LLC	Technology Equipment	N/A
Kraft Heinz Co	Food & Beverages	65.35	Motorola Solutions Inc	Technology Equipment	82.62
Kraft Heinz Foods Co	Food & Beverages	74.67	MSCI Inc	Industrial & Commercial Services	39.99
Kroger Co	Food & Drug Retailing	73.12	Murphy Oil Corp	Energy - Fossil Fuels	54.81
L Brands Inc	Retailers	67.59	Mylan NV	Pharma & Medical Research	47.87
L3 Technologies Inc	Industrial Goods	21.02	Nabors Industries Ltd	Energy - Fossil Fuels	46.33
L3Harris Technologies Inc	Industrial Goods	55.49	Nasdaq Inc	Banking & Investment Services	53.41
Laboratory Corporation of America F	Ho Healthcare Services & Equipment	61.34	National Oilwell Varco Inc	Energy - Fossil Fuels	68.76
Lam Research Corp	Technology Equipment	58.33	National Semiconductor Corp	Technology Equipment	74.49
Lamb Weston Holdings Inc	Food & Beverages	41.59	Navient Corp	Banking & Investment Services	41.58
Las Vegas Sands Corp	Cyclical Consumer Services	54.65	Nektar Therapeutics	Pharma & Medical Research	43.67
Legg Mason Inc	Banking & Investment Services	67.51	NetApp Inc	Technology Equipment	46.27
Leggett & Platt Inc	Cyclical Consumer Products	48.34	Netflix Inc	Software & IT Services	29.34
Leidos Holdings Inc	Software & IT Services	78.68	New York Times Co	Cyclical Consumer Services	53.21
Lennar Corp	Cyclical Consumer Products	34.08	Newell Brands Inc	Cyclical Consumer Products	60.29
Level 3 Parent LLC	Telecommunications Services	N/A	Newfield Exploration Co	Energy - Fossil Fuels	57.61
Lexmark International Inc	Technology Equipment	75.38	Newmont Goldcorp Corp	Mineral Resources	81.49
Life Technologies Corp	Pharma & Medical Research	78.38	News Corp	Cyclical Consumer Services	41.90
Lincoln National Corp	Insurance	67.61	Nextera Energy Inc	Utilities Utilities	67.77
Linde PLC	Chemicals	84.29	Nicor Inc	Utilities	51.17
Linear Technology Corp	Technology Equipment	33.78	Nielsen Holdings PLC	Cyclical Consumer Services	53.53
LKQ Corp	Automobiles & Auto Parts	28.00	Nike Inc	Cyclical Consumer Products	71.91
Lockheed Martin Corp	Industrial Goods	76.69	NiSource Inc	Utilities Utilities	69.26
•		37.21			41.25
Loews Corp	Insurance	23.53	Noble Corporation PLC	Energy - Fossil Fuels	59.88
Lorillard LLC	Food & Beverages Retailers	79.11	Noble Energy Inc	Energy - Fossil Fuels	79.00
Lowe's Companies Inc		76.50	Nordstrom Inc	Retailers	72.42
LSI Corp	Technology Equipment	60.76	Norfolk Southern Corp	Transportation	76.28
LyondellBasell Industries NV	Chemicals		Northern Trust Corp	Banking & Investment Services	75.60
M&T Bank Corp	Banking & Investment Services	43.50	Northrop Grumman Corp	Industrial Goods	
Macerich Co	Real Estate	64.07	Norwegian Cruise Line Holdings Ltd	Cyclical Consumer Services	40.22
Macy's Inc	Retailers	69.59	Novellus Systems Inc	Technology Equipment	52.99
Mallinckrodt Plc	Pharma & Medical Research	58.36	NRG Energy Inc	Utilities	64.75
Marathon Oil Corp	Energy - Fossil Fuels	79.22	Nucor Corp	Mineral Resources	58.66
Marathon Petroleum Corp	Energy - Fossil Fuels	71.63	nVent Electric PLC	Industrial Goods	44.10
Marketaxess Holdings Inc	Banking & Investment Services	47.90	NVIDIA Corp	Technology Equipment	80.23
Marriott International Inc	Cyclical Consumer Services	72.67	NVR Inc	Cyclical Consumer Products	34.80
Marsh & McLennan Companies Inc	Insurance	60.02	NYSE Euronext	Banking & Investment Services	66.34
Marshall & Ilsley Corp	Banking & Investment Services	N/A	Occidental Petroleum Corp	Energy - Fossil Fuels	75.27
Martin Marietta Materials Inc	Mineral Resources	43.03	Office Depot Inc	Retailers	72.33
Masco Corp	Cyclical Consumer Products	64.48	Omnicom Group Inc	Cyclical Consumer Services	60.67
Mastercard Inc	Software & IT Services	66.04	ONEOK Inc	Energy - Fossil Fuels	65.34
Mattel Inc	Cyclical Consumer Products	69.18		Software & IT Services	N/A
Maxim Integrated Products Inc	Technology Equipment	58.92	Oracle Corp	Software & IT Services	73.97
McAfee LLC	Software & IT Services	N/A	O'Reilly Automotive Inc	Retailers	43.09
McCormick & Company Inc	Food & Beverages	57.49	Owens-Illinois Inc	Applied Resources	43.24
Mcdonald's Corp	Cyclical Consumer Services	74.66	Paccar Inc	Industrial Goods	54.03
McKesson Corp	Food & Drug Retailing	70.43	Packaging Corp of America	Applied Resources	46.73
Mead Johnson Nutrition Co	Food & Beverages	61.76	Pactiv LLC	Applied Resources	N/A
Medco Health Solutions Inc	Food & Drug Retailing	76.80	Pall Corp	Industrial Goods	70.12
Medtronic PLC	Healthcare Services & Equipment	76.44	Parker-Hannifin Corp	Industrial Goods	56.37
Merck & Co Inc	Pharma & Medical Research	76.16	Patterson Companies Inc	Healthcare Services & Equipment	45.68
Meredith Corp	Cyclical Consumer Services	72.16	Paychex Inc	Industrial & Commercial Services	45.38
MetLife Inc	Insurance	69.52	PayPal Holdings Inc	Software & IT Services	62.10
Mettler-Toledo International Inc	Industrial Goods	60.33	Peabody Energy Corp	Energy - Fossil Fuels	73.18
MGM Resorts International	Cyclical Consumer Services	64.53	Pentair PLC	Industrial Goods	54.82
Micro Focus Software Inc	Software & IT Services	65.86	People's United Financial Inc	Banking & Investment Services	40.90
Microchip Technology Inc	Technology Equipment	58.96	Pepco Holdings LLC	Utilities	64.44
Micron Technology Inc	Technology Equipment	58.83	Pepsi Bottling Group Inc	Food & Beverages	N/A
Microsoft Corp	Software & IT Services	92.28	PepsiCo Inc	Food & Beverages	85.10
Mid-America Apartment Communitie	es Real Estate	45.43	PerkinElmer Inc	Healthcare Services & Equipment	66.47
Mohawk Industries Inc	Cyclical Consumer Products	62.56	Perrigo Company PLC	Pharma & Medical Research	53.18
Molex LLC	Industrial Goods	47.58	Perspecta Inc	Software & IT Services	54.43
Molson Coors Brewing Co	Food & Beverages	66.19	PetSmart Inc	Retailers	55.71
Mondelez International Inc	Food & Beverages	84.38	Pfizer Inc	Pharma & Medical Research	76.61
Monsanto Co	Chemicals	61.47	PG&E Corp	Utilities	81.65
Monster Beverage Corp	Food & Beverages	24.17	Philip Morris International Inc	Food & Beverages	67.49
Monster Worldwide Inc	Industrial & Commercial Services	27.77	Phillips 66	Energy - Fossil Fuels	72.17
Moody's Corp	Industrial & Commercial Services	65.31	Pinnacle West Capital Corp	Utilities	71.21

Pioneer Natural Resources Co	Energy - Fossil Fuels	46.10	Snap-On Inc	Industrial Goods	59.41
Pitney Bowes Inc	Technology Equipment	58.23	Southern Co	Utilities	65.36
Plum Creek Timber Company Inc	Real Estate	71.75	Southern Company Gas	Utilities	56.31
PNC Financial Services Group Inc	Banking & Investment Services	79.33	Southwest Airlines Co	Transportation	72.01
PPG Industries Inc	Chemicals	70.79	Southwestern Energy Co	Energy - Fossil Fuels	62.07
PPL Corp	Utilities	62.17	Spectra Energy Corp	Energy - Fossil Fuels	73.77
Praxair Inc	Chemicals	N/A	Sprint Communications Inc	Telecommunications Services	72.96
Precision Castparts Corp	Industrial Goods	36.52	St Jude Medical Inc	Healthcare Services & Equipment	56.62
Principal Financial Group Inc	Insurance	67.51	Stanley Black & Decker Inc	Industrial Goods	58.90
Procter & Gamble Co	Personal & Household Prod. & Serv.	76.32	Staples Inc	Retailers	84.20
Progress Energy Inc	Utilities	68.38	Starbucks Corp	Cyclical Consumer Services	82.67
Progressive Corp	Insurance	63.75	Starwood Hotels & Resorts Worldwide I		N/A 84.10
Prologis Inc Prudential Financial Inc	Real Estate	83.04 80.70	State Street Corp	Banking & Investment Services Industrial & Commercial Services	53.66
	Insurance Utilities	77.02	Stericycle Inc	Healthcare Services & Equipment	59.39
Public Service Enterprise Group Inc	Real Estate	45.72	Stryker Corp Sunedison Inc		59.18
Public Storage PulteGroup Inc	Cyclical Consumer Products	52.73	Sunoco Inc	Renewable Energy Energy - Fossil Fuels	76.38
PVH Corp	Cyclical Consumer Products	68.85	SunTrust Banks Inc	Banking & Investment Services	52.11
QEP Resources Inc	Energy - Fossil Fuels	49.94	SUPERVALU Inc	Food & Drug Retailing	53.12
Qlogic LLC	Technology Equipment	31.03	SVB Financial Group	Banking & Investment Services	55.94
Oorvo Inc	Technology Equipment	43.41	Symantec Corp	Software & IT Services	83.16
Qualcomm Inc	Technology Equipment	71.62	Synchrony Financial	Banking & Investment Services	49.65
Quality Care Properties Inc	Real Estate	38.99	Synopsys Inc	Software & IT Services	50.36
Quanta Services Inc	Industrial & Commercial Services	35.82	Sysco Corp	Food & Drug Retailing	70.85
Quest Diagnostics Inc	Healthcare Services & Equipment	61.01	T. Rowe Price Group Inc	Banking & Investment Services	56.75
Qwest Communications International		64.75	Take-Two Interactive Software Inc	Cyclical Consumer Products	40.81
Ralph Lauren Corp	Cyclical Consumer Products	45.10	Tapestry Inc	Retailers	59.02
Range Resources Corp	Energy - Fossil Fuels	60.69	Target Corp	Retailers	83.14
Raymond James Financial Inc	Banking & Investment Services	44.19	TE Connectivity Ltd	Industrial Goods	70.50
Raytheon Co	Industrial Goods	76.19	TechnipFMC PLC	Energy - Fossil Fuels	46.30
Realty Income Corp	Real Estate	57.46	TECO Energy Inc	Utilities	54.92
Red Hat Inc	Software & IT Services	46.43	Tegna Inc	Cyclical Consumer Services	59.17
Regency Centers Corp	Real Estate	67.06	Teleflex Inc	Healthcare Services & Equipment	42.58
Regeneron Pharmaceuticals Inc	Pharma & Medical Research	55.16	Tellabs Inc	Technology Equipment	52.29
Regions Financial Corp	Banking & Investment Services	54.20	Tenet Healthcare Corp	Healthcare Services & Equipment	74.62
Republic Services Inc	Industrial & Commercial Services	56.41	Teradata Corp	Software & IT Services	80.21
Resideo Technologies Inc	Industrial Goods	N/A	Teradyne Inc	Technology Equipment	59.21
Resmed Inc	Healthcare Services & Equipment	58.52	Texas Instruments Inc	Technology Equipment	91.48
Reynolds American Inc	Food & Beverages	53.58	Textron Inc	Industrial Goods	65.76
Robert Half International Inc	Industrial & Commercial Services	47.68	Thermo Fisher Scientific Inc	Healthcare Services & Equipment	75.06
Rockwell Automation Inc	Industrial Goods	66.30	Tiffany & Co	Retailers	68.02
Rockwell Collins Inc	Industrial Goods	66.90	Time Warner Cable Inc	Cyclical Consumer Services	65.90
Rollins Inc	Industrial & Commercial Services	36.95	Time Warner Inc	Cyclical Consumer Services	78.16
Roper Technologies Inc	Industrial Goods	36.78	Titanium Metals Corp	Mineral Resources	34.90
Ross Stores Inc	Retailers	48.31	TJX Companies Inc	Retailers	75.30
Rowan Companies PLC	Energy - Fossil Fuels	40.68	T-Mobile US Inc	Telecommunications Services	37.90
Royal Caribbean Cruises Ltd	Cyclical Consumer Services	64.18	Total System Services Inc	Software & IT Services	58.24
RR Donnelley & Sons Co	Industrial & Commercial Services	73.41	Tractor Supply Co	Retailers	61.54
RS Legacy Corp	Retailers	59.16	TransDigm Group Inc	Industrial Goods	18.94
Ryder System Inc	Transportation	73.32	Transocean Ltd	Energy - Fossil Fuels	58.88
S&P Global Inc	Industrial & Commercial Services	72.28	Travelers Companies Inc	Insurance	57.37 22.88
Safeway Inc	Food & Drug Retailing	65.53	TripAdvisor Inc	Cyclical Consumer Services	
Salesforce.Com Inc Sandisk LLC	Software & IT Services Technology Equipment	66.91 46.34	Twenty-First Century Fox Inc Twitter Inc	Cyclical Consumer Services Software & IT Services	56.18 36.78
	Technology Equipment	40.99			57.50
SBA Communications Corp	Real Estate	47.84	Tyson Foods Inc	Food & Beverages	67.94
SCANA Corp	Utilities Engage Fossil Fossis	75.99	U.S. Bancorp UDR Inc	Banking & Investment Services	49.58
Schlumberger NV	Energy - Fossil Fuels Cyclical Consumer Services	49.88	Ulta Beauty Inc	Real Estate Retailers	46.94
Scripps Networks Interactive Inc Seagate Technology PLC	•	56.85	Under Armour Inc	Cyclical Consumer Products	36.53
Sealed Air Corp	Technology Equipment Applied Resources	52.13	Union Pacific Corp	Transportation	65.09
Sears Holdings Corp	Retailers	70.66	United Airlines Holdings Inc	Transportation	49.66
Sempra Energy	Utilities	75.78	United Parcel Service Inc	Transportation	71.63
Sherwin-Williams Co	Chemicals	65.18	United Parcer Service Inc	Industrial & Commercial Services	43.86
Sigma-Aldrich Corp	Chemicals	72.21	United States Steel Corp	Mineral Resources	54.33
Signet Jewelers Ltd	Retailers	71.36	United Technologies Corp	Industrial Goods	80.42
Simon Property Group Inc	Real Estate	55.95	United Health Group Inc	Healthcare Services & Equipment	74.78
Skyworks Solutions Inc	Technology Equipment	63.81	Universal Health Services Inc	Healthcare Services & Equipment	35.98
	Real Estate	61.96	Unum Group	Insurance	64.46
SL Green Realty Corn					0 7.70
SL Green Realty Corp SLM Corp	Banking & Investment Services	41.13	Urban Outfitters Inc	Retailers	36.06

Valaris PLC	Energy - Fossil Fuels	53.20	VF Corp	Cyclical Consumer Products	64.23
Valero Energy Corp	Energy - Fossil Fuels	73.44	Whirlpool Corp	Cyclical Consumer Products	67.24
Walgreens Boots Alliance Inc	Food & Drug Retailing	66.29	Whole Foods Market Inc	Food & Drug Retailing	67.63
Walmart Inc	Food & Drug Retailing	79.48	Viacom Inc	Cyclical Consumer Services	61.32
Walt Disney Co	Cyclical Consumer Services	77.45	Viavi Solutions Inc	Technology Equipment	46.52
Varex Imaging Corp	Healthcare Services & Equipment	36.67	Williams Companies Inc	Energy - Fossil Fuels	61.71
Varian Medical Systems Inc	Healthcare Services & Equipment	61.75	Willis Towers Watson PLC	Insurance	44.28
Waste Management Inc	Industrial & Commercial Services	80.44	Windstream Holdings Inc	Telecommunications Services	32.89
Waters Corp	Healthcare Services & Equipment	68.28	Visa Inc	Software & IT Services	56.52
Wec Acquisition Corp	Utilities	59.15	Vornado Realty Trust	Real Estate	56.23
WEC Energy Group Inc	Utilities	75.83	WPX Energy Inc	Energy - Fossil Fuels	43.98
WellCare Health Plans Inc	Healthcare Services & Equipment	49.37	Vulcan Materials Co	Mineral Resources	59.48
Wells Fargo & Co	Banking & Investment Services	80.40	Wyndham Destinations Inc	Cyclical Consumer Services	68.39
Welltower Inc	Real Estate	62.80	Wynn Resorts Ltd	Cyclical Consumer Services	39.40
Ventas Inc	Real Estate	67.40	Xcel Energy Inc	Utilities	70.62
Verisign Inc	Software & IT Services	53.58	Xerox Holdings Corp	Technology Equipment	76.98
Verisk Analytics Inc	Software & IT Services	54.29	Xilinx Inc	Technology Equipment	59.04
Verizon Communications Inc	Telecommunications Services	78.78	XL Group Ltd	Insurance	54.88
Versum Materials Inc	Chemicals	48.32	XTO Energy Inc	Energy - Fossil Fuels	N/A
Vertex Pharmaceuticals Inc	Pharma & Medical Research	47.11	Xylem Inc	Industrial Goods	67.06
Western Digital Corp	Technology Equipment	55.67	Yum China Holdings Inc	Cyclical Consumer Services	53.84
Western Union Co	Industrial & Commercial Services	55.66	Yum! Brands Inc	Cyclical Consumer Services	66.31
Westinghouse Air Brake Technologies Industrial Goods		37.58	Zimmer Biomet Holdings Inc	Healthcare Services & Equipment	69.49
Westrock Co	Applied Resources	44.20	Zions Bancorporation NA	Banking & Investment Services	36.65
Westrock MWV LLC	Applied Resources	64.29	Zoetis Inc	Pharma & Medical Research	55.49
Weyerhaeuser Co	Real Estate	84.07			